

# Retrieval with Infrared Atmospheric Sounding Interferometer and validation during JAIVE<sub>x</sub>

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# Talk Outline

- 1. LaRC IR-only Retrieval Algorithm Introduction**
- 2. Retrieval Demonstration: Global and Regional Cases**
- 3. Validation with Radiosondes and Dropsondes**
- 4. IASI, AIRS, and NAST-I Inter-comparison**
- 5. Summary and Future Work**

# LaRC IR Retrieval Algorithm

## PART A: REGRESSION RETRIEVAL (Zhou et al., GRL 2005)

Using **an all-seasonal-global training database** to diagnose 0-2 cloud layers from training relative humidity profile:

*A single cloud layer is inserted into the input training profile. Approximate lower level cloud using opaque cloud representation.*

Use parameterization of balloon and aircraft cloud microphysical data base to specify cloud effective particle diameter and cloud optical depth:

*Different cloud microphysical properties are simulated for same training profile using random number generator to specify visible cloud optical depth within a reasonable range. Different habitats can be specified (Hexagonal columns assumed here).*

Use LBLRTM/DISORT “lookup table” to specify cloud radiative properties:

*Spectral transmittance and reflectance for ice and liquid clouds interpolated from multi-dimensional look-up table based on DISORT multiple scattering calculations.*

Compute EOFs and Regressions from clear, cloudy, and mixed radiance data base:

*Regress cloud, surface properties & atmospheric profile parameters against radiance EOFs.*

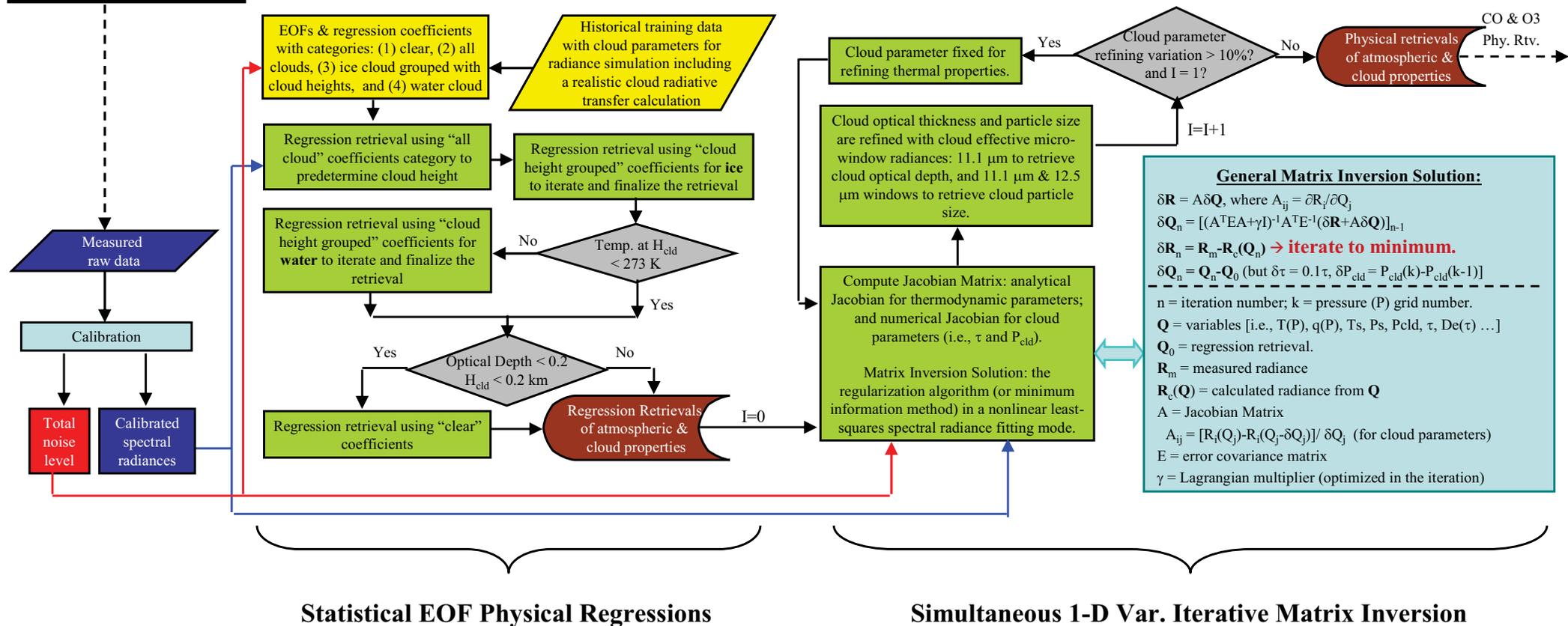
## PART B: 1-D VAR. PHYSICAL RETRIEVAL (Zhou et al., JAS 2007)

A one-dimensional (1-d) variational solution with the regularization algorithm (i.e., the minimum information method) is chosen for physical retrieval methodology which uses the regression solution as the initial guess.

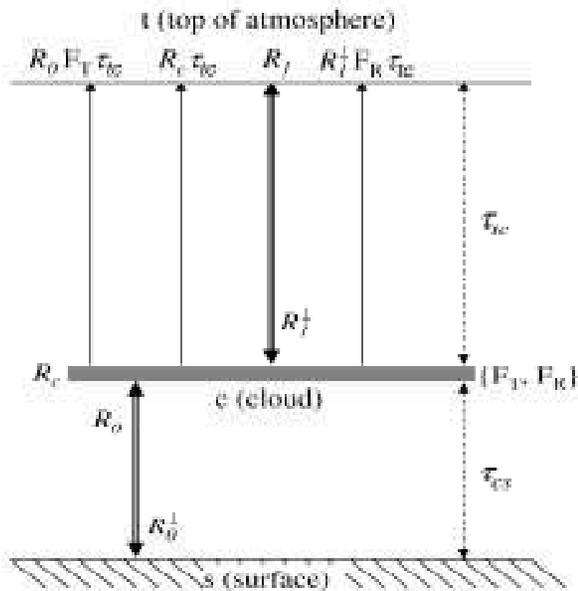
Cloud optical/microphysical parameters, namely effective particle diameter and visible optical thickness, are further refined with the radiances observed within the 10.4  $\mu\text{m}$  to 12.5  $\mu\text{m}$  window region.

# LaRC Algorithm Flowchart

## HYBRID RETRIEVAL ALGORITHM FLOWCHART



# Radiative Transfer Model (include clouds)



$$R = R_0 F_T \tau_{tc} + R_c \tau_{tc} + R_1 + R_1^\downarrow F_R \tau_{tc}$$

$$R_0 = \varepsilon B_s \tau_{cs} + \int_{\tau_{cs}}^1 B d\tau + (1 - \varepsilon) R_0^\downarrow \tau_{cs}$$

$$R_0^\downarrow = \tau_{cs} (R_1^\downarrow F_T + R_c) + \int_{\tau_{cs}}^1 B d\tau'$$

$$R_c = (1 - F_R - F_T) B(T_c)$$

$$R_1 = \int_{\tau_{tc}}^1 B d\tau$$

$$R_1^\downarrow = \int_{\tau_{tc}}^1 B d\tau'$$

$R$  = upwelling spectral radiance at the top of atmosphere

$F_T$  = cloud transmissive function

$F_R$  = cloud reflective function

$R_0$  = upwelling emission below the cloud

$R_0^\downarrow$  = downwelling emission below the cloud

$R_c$  = emission from the cloud

$R_1$  = upwelling emission above the cloud

$R_1^\downarrow$  = downwelling emission above the cloud

$\varepsilon$  = surface emissivity

$B$  = Planck function

$\tau$  = total transmittance from any given level to an upper boundary such as cloud level or the top of the atmosphere

$\tau'$  = the total transmittance from any given level to a lower boundary such as cloud level or the Earth's surface

$\tau_{cs}$  = transmittance between the cloud level and the Earth's surface

$\tau_{tc}$  = transmittance between the top of the atmosphere and cloud level

# EOF Physical Regression Inversion

Statistics are formulated for one class of data which contains all cloud height conditions

and

2 other classes for which the cloud phase has been stratified to liquid and ice.

$$R = R_0 F_T \tau_{tc} + R_c \tau_{tc} + R_1 + R_1^\downarrow F_R \tau_{tc},$$

$$M_{ij} = \frac{1}{S} \sum_{k=1}^S \mathfrak{R}_{ki} \mathfrak{R}_{kj}$$

$$C_i = \sum_{j=1}^{nc} R_j E_{ji}$$

$$A_m = \sum_{i=1}^{n-1} K_{mi} C_i + K_{mn} P_s = \sum_{i=1}^{n-1} K_{mi} \left( \sum_{j=1}^{nc} R_j E_{ji} \right) + K_{mn} P_s$$

$$\Psi_i = \sum_{j=1}^5 \varepsilon_j e_{ji}$$

R = radiance

$P_s$  = surface pressure

S = number of sample profiles

$\mathfrak{R}$  = radiance deviation from the mean

M = covariance matrix of  $\mathfrak{R}$

E = eigenvectors of M – EOFs

C = radiance EOF amplitudes

A =  $\{T_s, \psi, T, q, \dots \text{Hcld}, \tau_{\text{cld}}, \text{De}, \text{Pha}\}$  parameters

K = regression coefficients

$\psi$  = emissivity EOF amplitudes

$\varepsilon$  = emissivity

e = emissivity eigenvectors

$F_T$  = cloud transmissive function  $\{\text{Hcld}, \tau_{\text{cld}}, \text{De}, \text{Pha}\}$

$F_R$  = cloud reflective function  $\{\text{Hcld}, \tau_{\text{cld}}, \text{De}, \text{Pha}\}$

Hcld = cloud height

$\tau_{\text{cld}}$  = cloud optical depth

De = cloud particle diameter

Pha = cloud phase (ice or water cloud)

# 1-D Var. Physical Iterative Retrieval

$$Y = R_0 F_T \tau_{tc} + R_c \tau_{tc} + R_1 + R_1^\downarrow F_R \tau_{tc},$$

$$\delta Y = Y' \delta X$$

$$J(X) = [Y^m - Y(X)]^T E^{-1} [Y^m - Y(X)] + [X - X_0]^T (\gamma I) [X - X_0]$$

$$X_{n+1} = X_n + J''(X_n)^{-1} J'(X_n)$$

$$\delta X_{n+1} = (Y_n'^T E^{-1} Y_n' + \gamma I)^{-1} Y_n'^T E^{-1} (\delta Y_n + Y_n' \delta X_n)$$

$$\delta X_n = X_n - X_0$$

$$\delta Y_n = Y^m - Y(X_n)$$

$$\|Y[X(\gamma)] - Y^m\|^2 = \sigma^2$$

$$\gamma_{n+1} = q_n \gamma_n$$

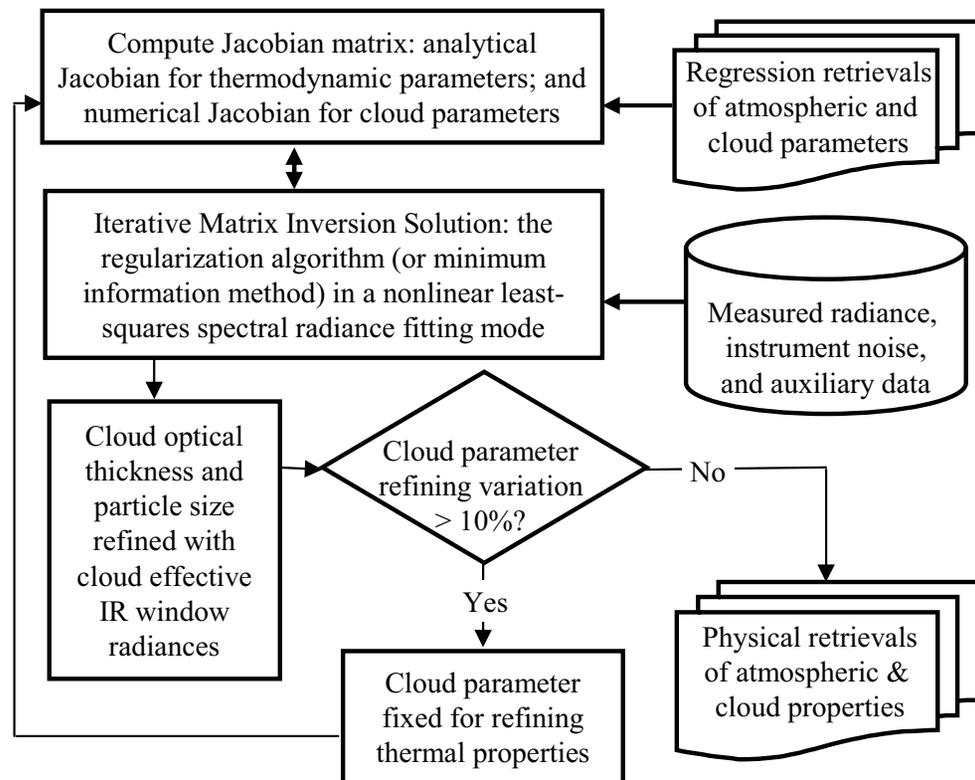
each iteration by satisfying the following conditions:

$$q_1 = 1.0;$$

$$\text{if } \|Y(X_n) - Y^m\| < \sigma^2, \text{ then } q_n = 1.5;$$

$$\text{if } \|Y(X_n) - Y^m\| > \sigma^2, \text{ then } q_n = 0.5;$$

$$\text{if } \|Y(X_n) - Y^m\| = \sigma^2, \text{ then stop the iteration;}$$



$Y$  = calculated Radiance

$X = \{T_s, T, q, o_3, co, \dots, Hcld, \tau_{cld}, De, Pha\}$

$Y^m$  = observed Radiance

$J$  = "Penalty function"

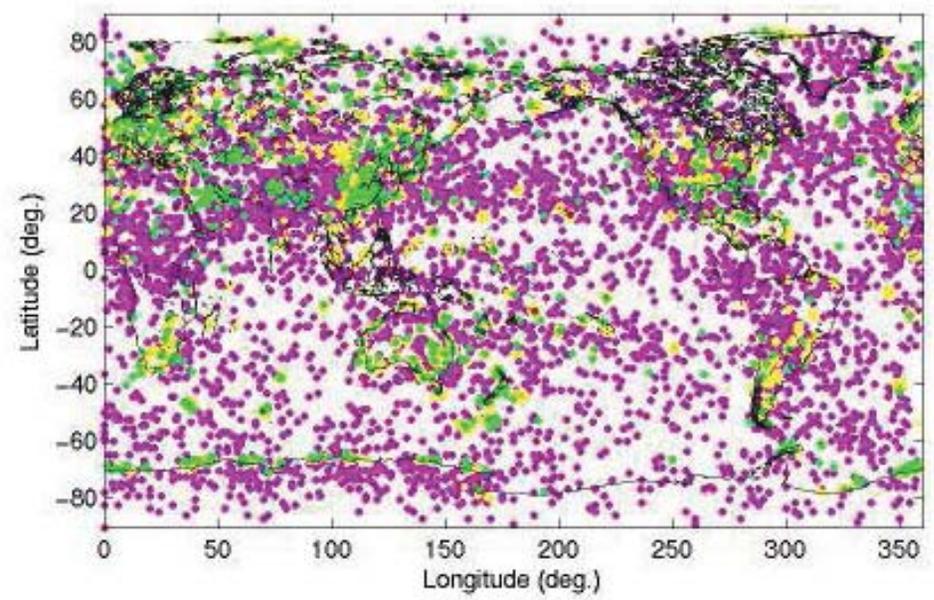
$\sigma$  = total noise

$E$  = error covariance matrix

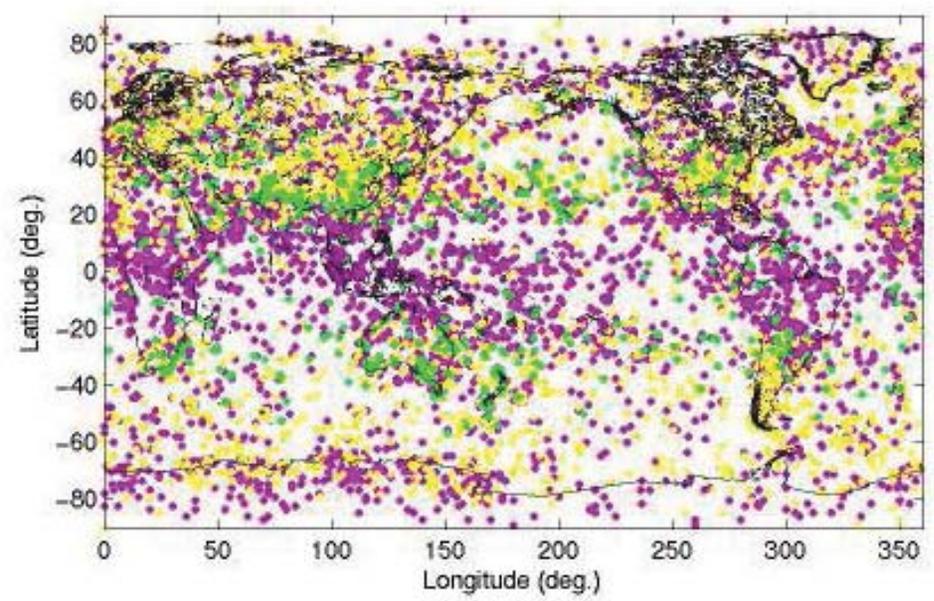
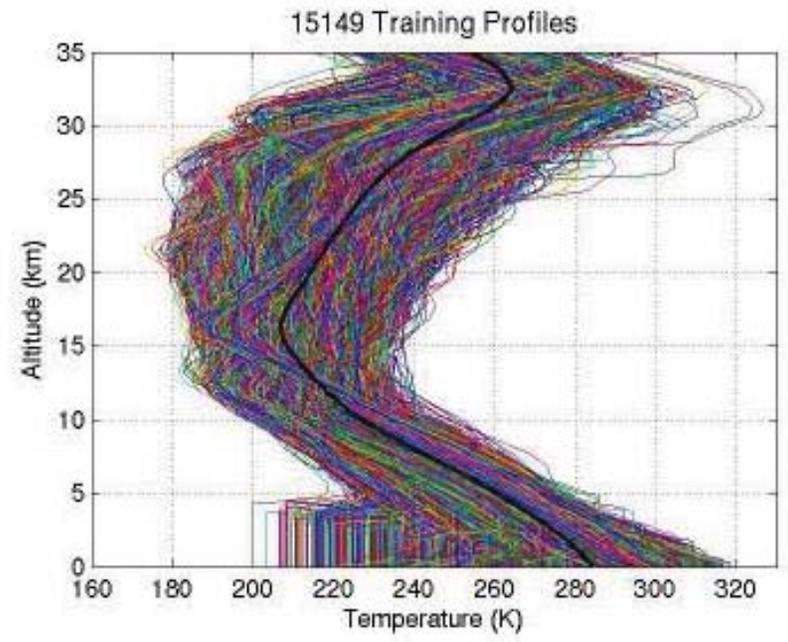
$\gamma$  = a smoothing factor

$n$  = iteration number

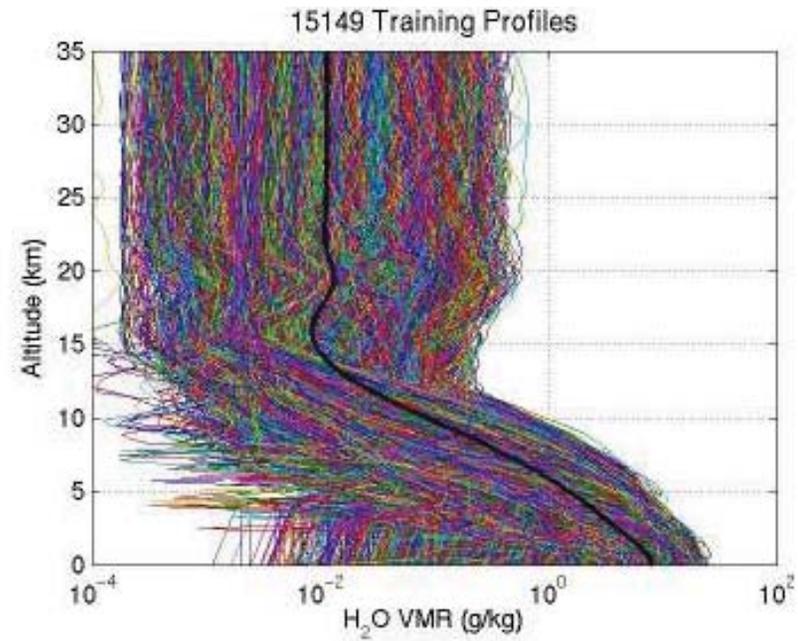
# Global Training for LaRC Algorithm



- 5569 ECMWF
- 6105 NOAA-88b
- 1375 TIGR-3
- 1534 Ozonesonde
- 566 Radiosonde

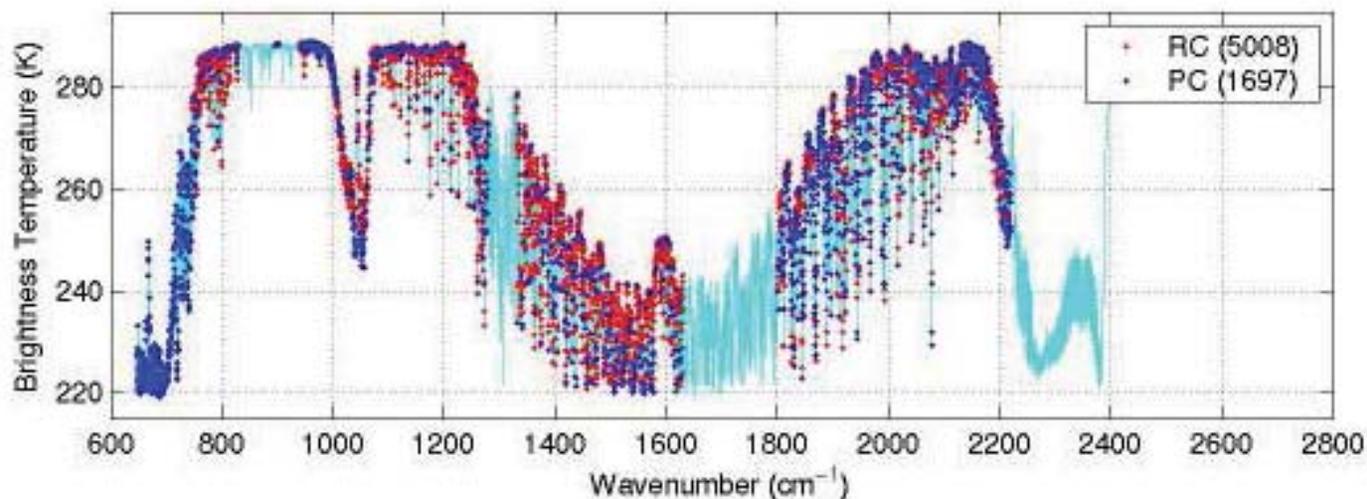


- 15149 Clear
- 4072 Ice Cloud
- 723 Water Cloud

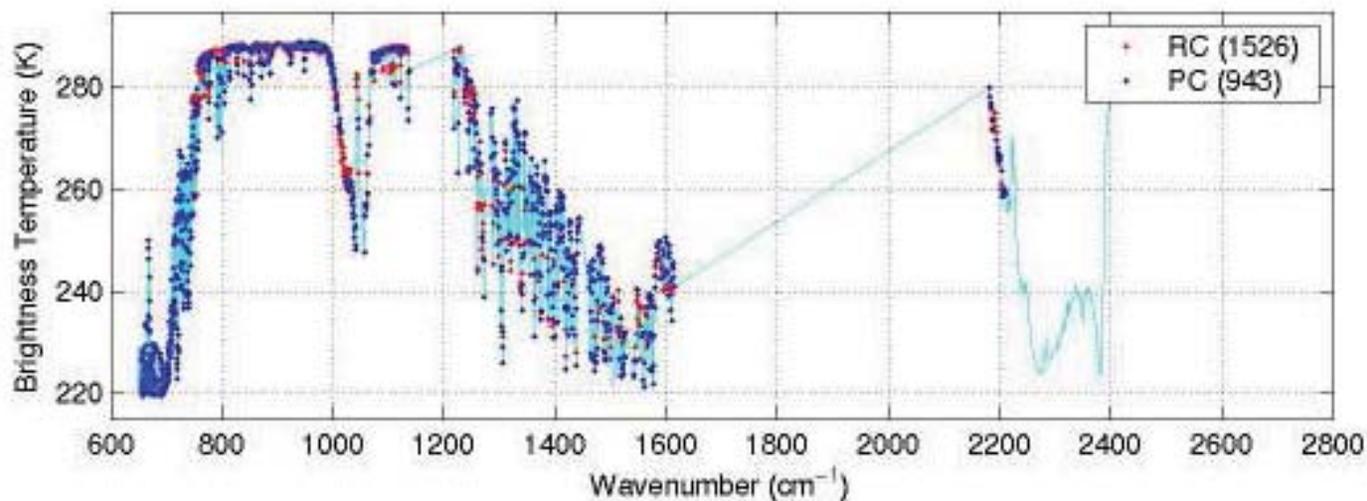


# Channel Used in LaRC Retrieval Algorithm

**IASI: 5008 channels for regression, 1697 channels for physical retrieval**

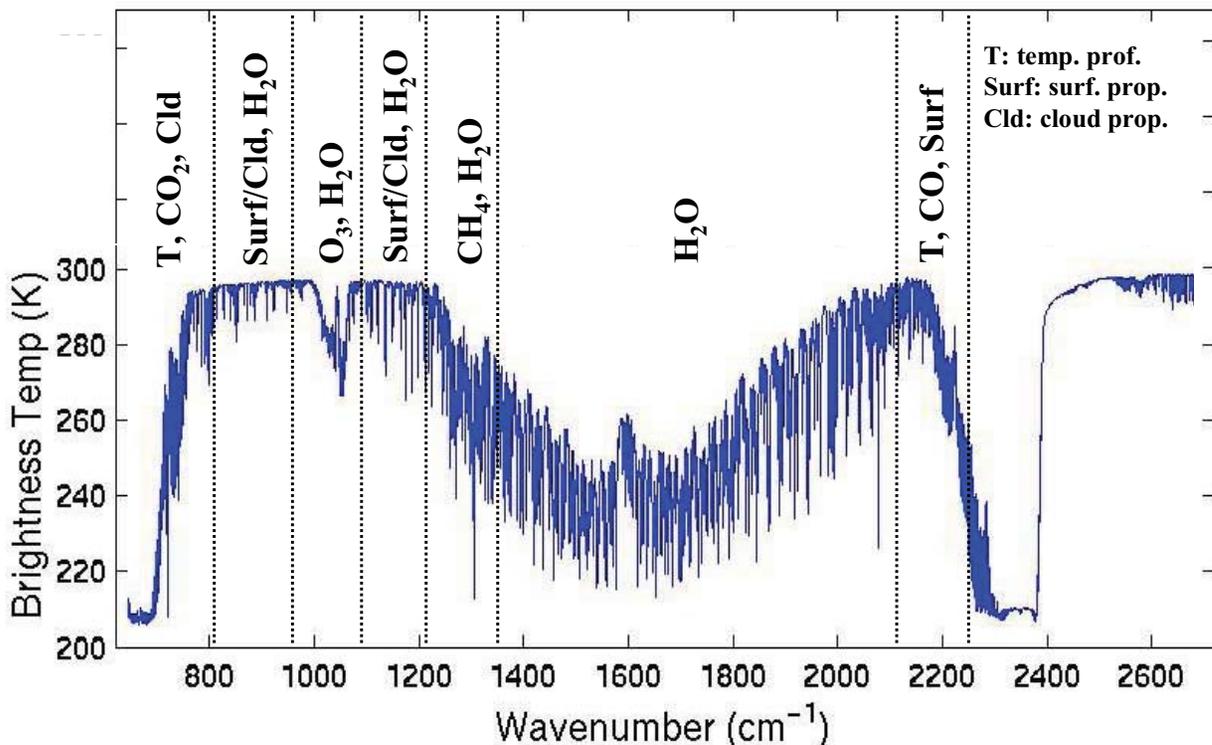


**AIRS: 1526 channels for regression, 943 channels for physical retrieval**

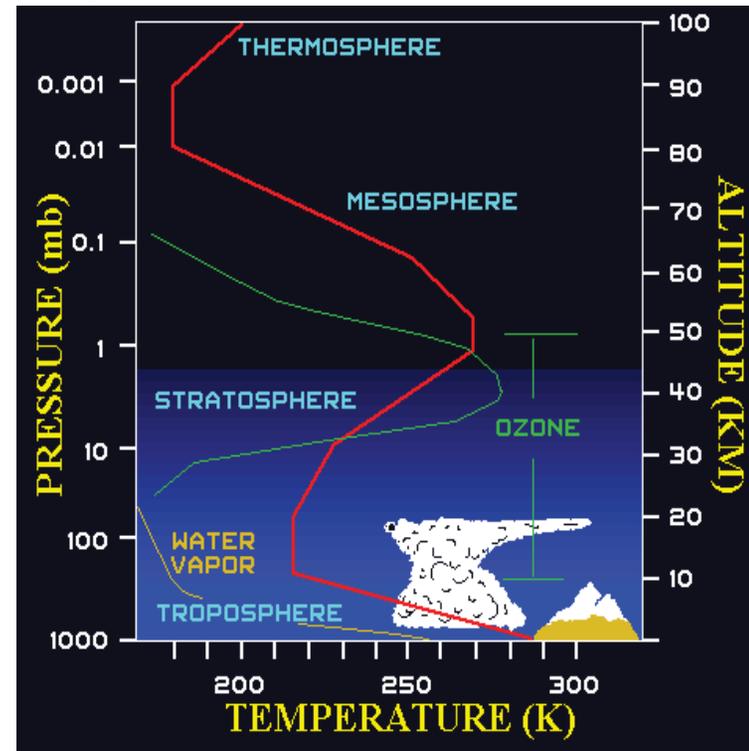


# Retrieval Parameters from this System

Brightness Temperature or Radiance Spectrum



Geophysical Parameters



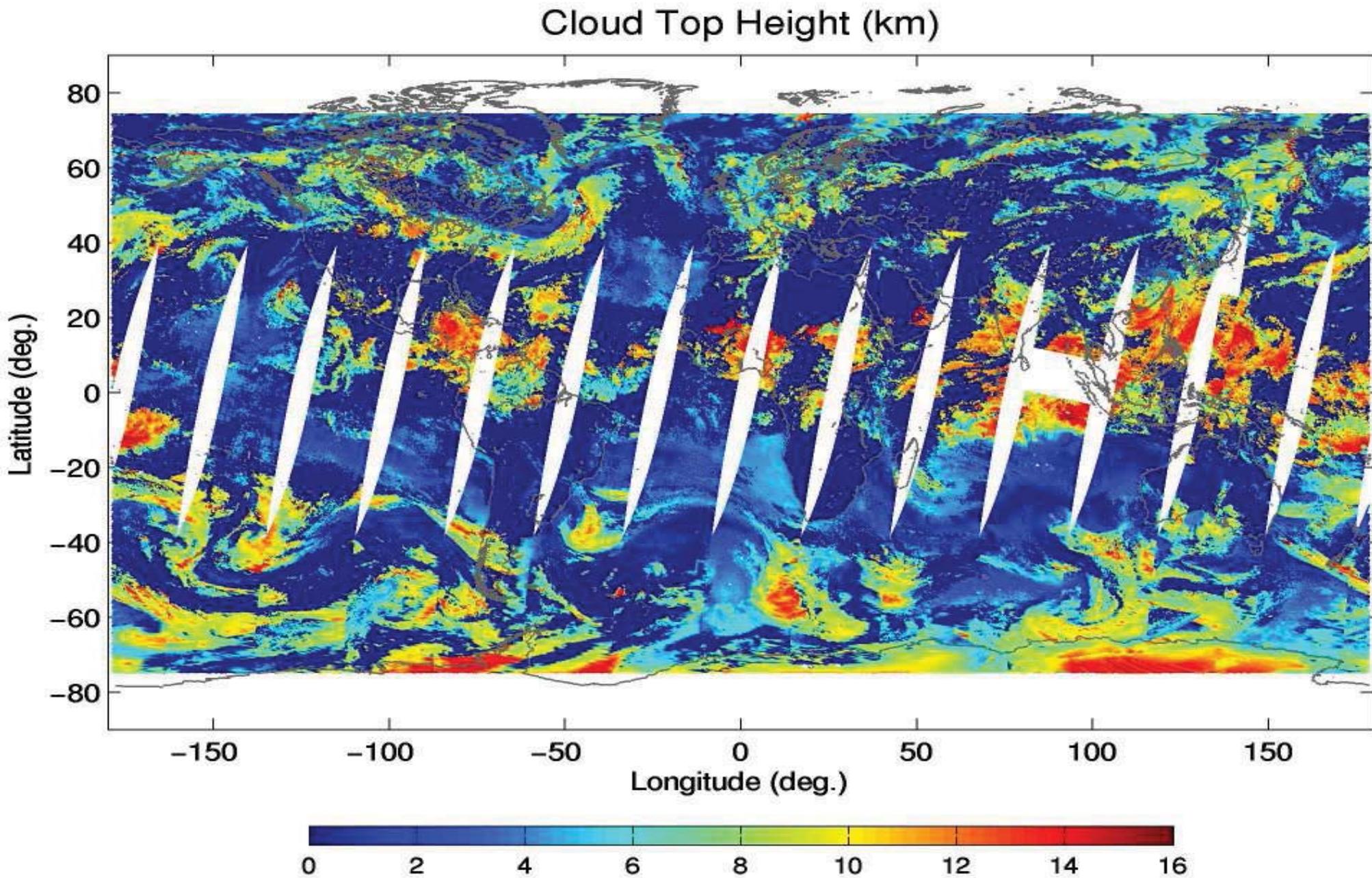
## Retrievals under clear conditions:

- Surface properties (skin temp and emissivity).
- Atmospheric temperature and moisture profiles.
- Atmospheric CO and O<sub>3</sub> abundances.

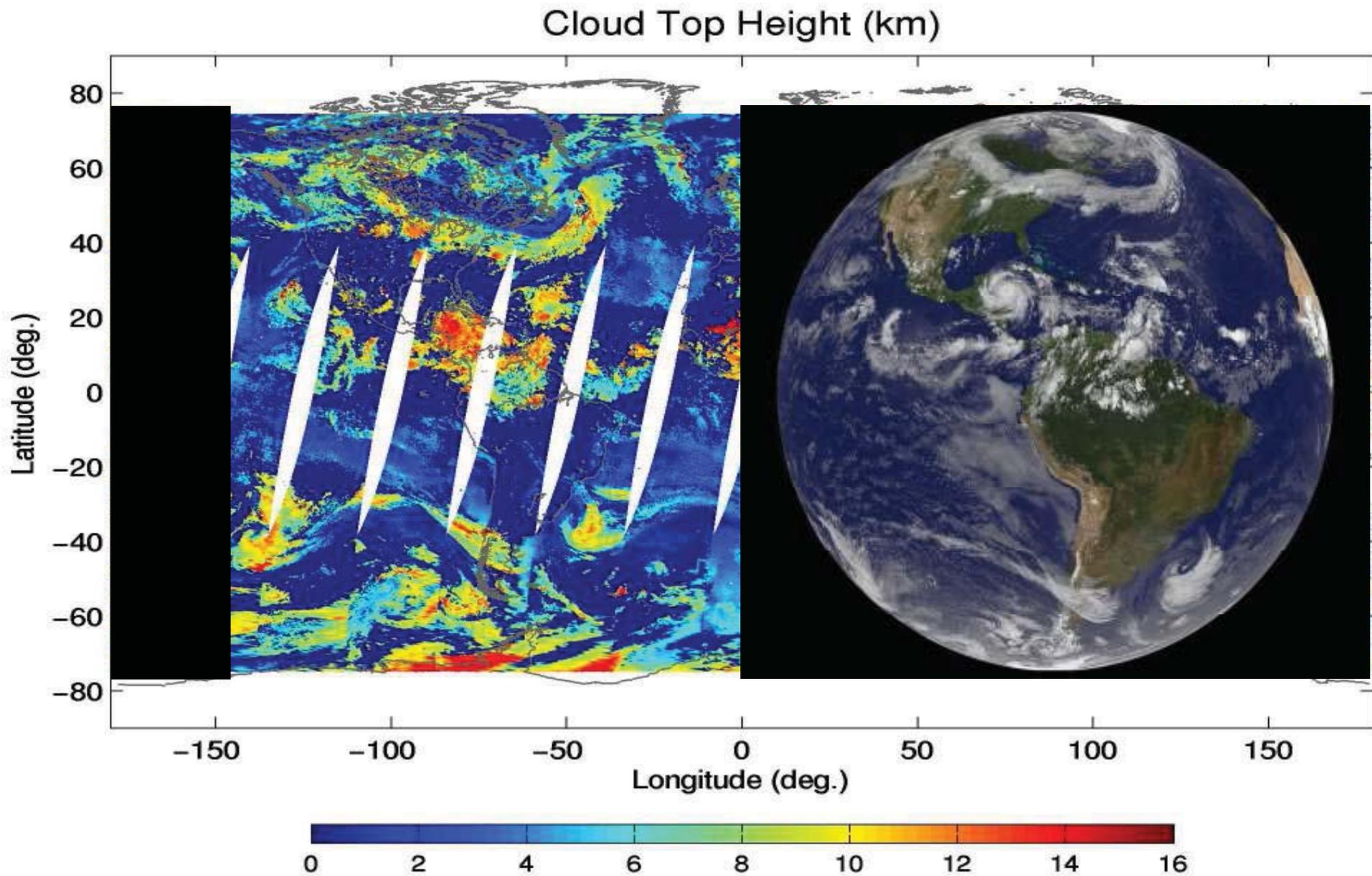
## Retrievals under cloudy conditions:

- Atmospheric profile through optically thin cirrus clouds and above optically thick clouds.
- Effective cloud parameters (i.e., cloud top pressure, particle size, and optical depth).

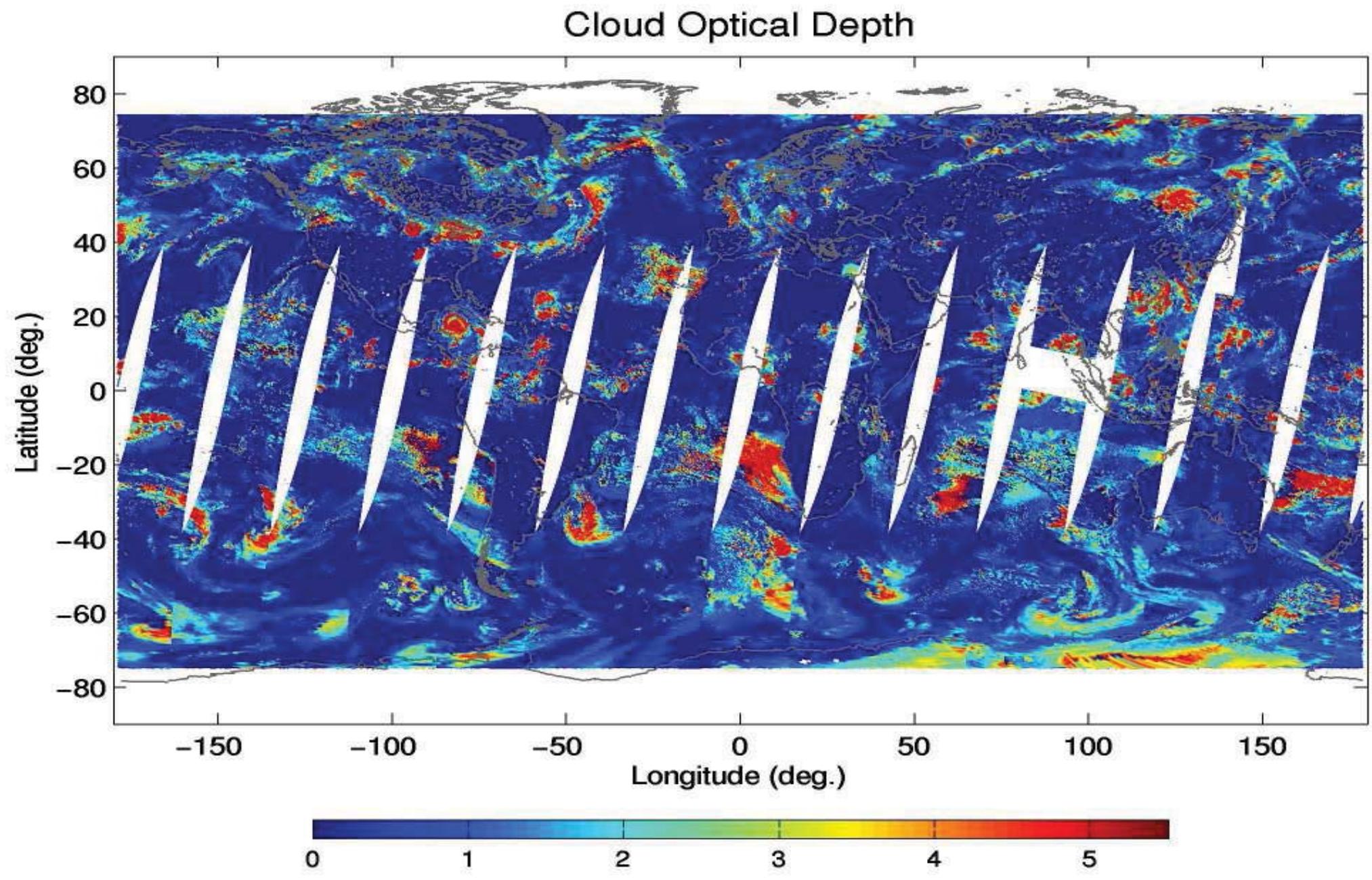
# IASI Retrieval Demo: Cloud Top Height



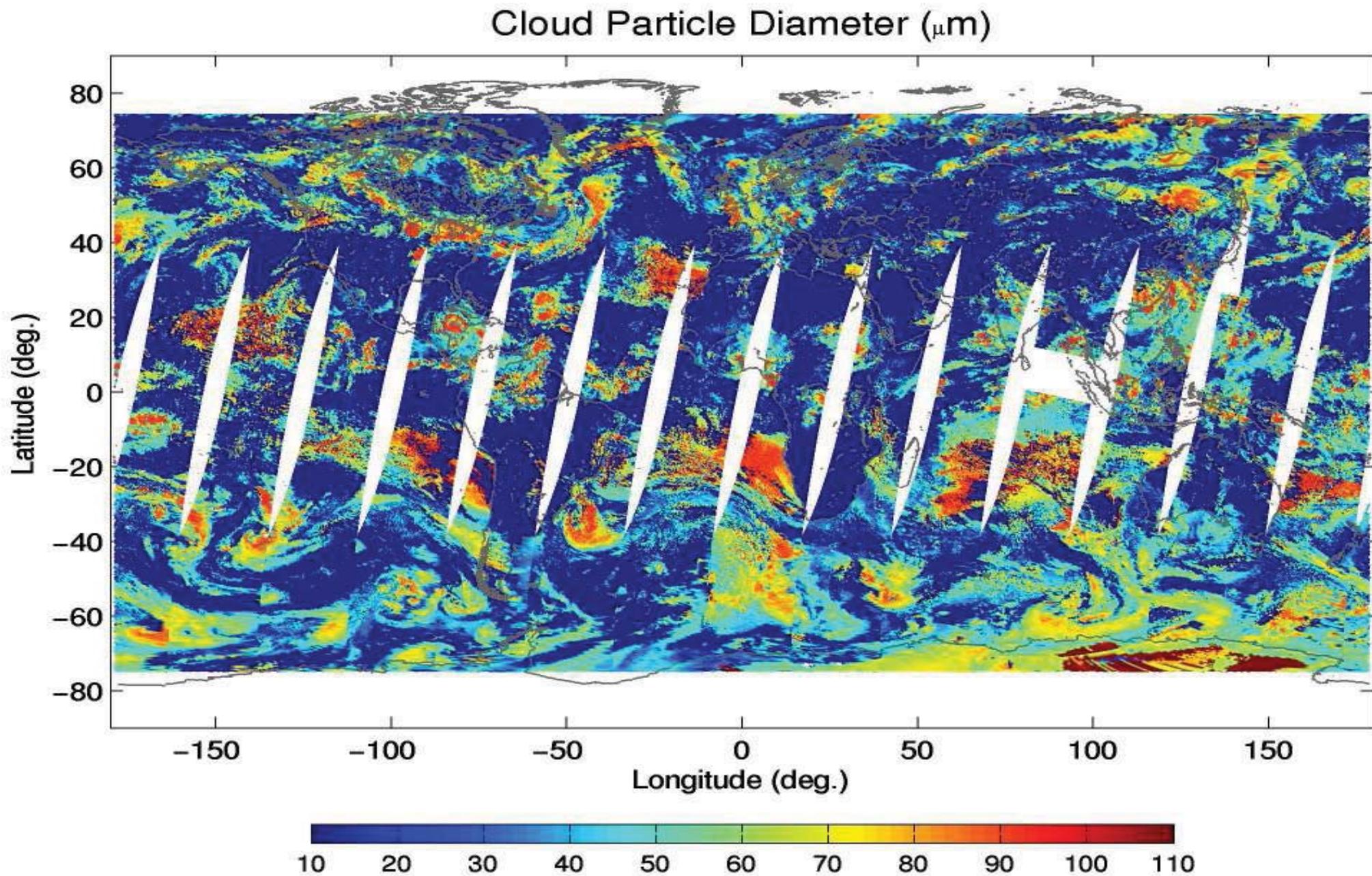
# IASI vs. GOES-12: Cloud



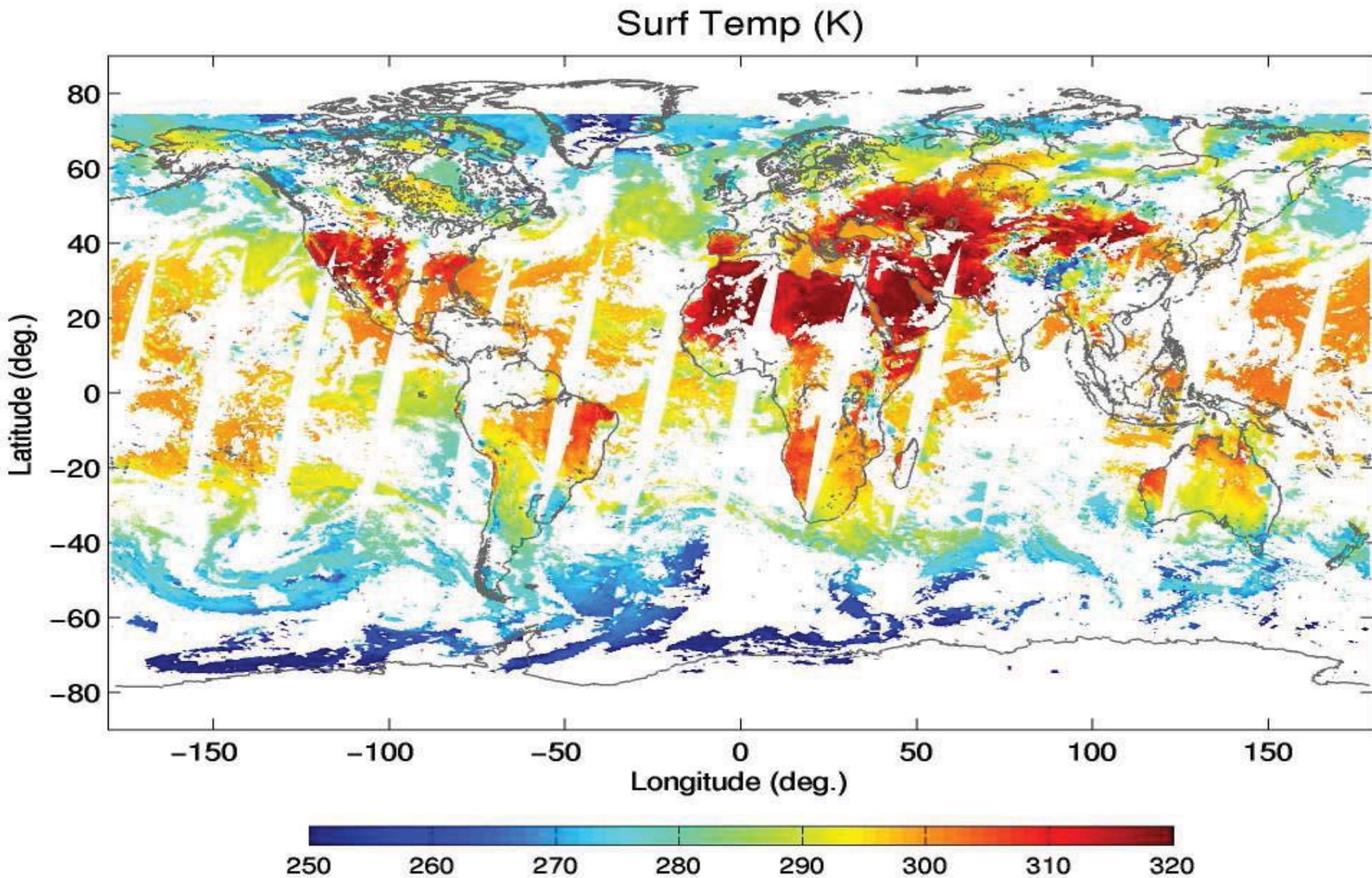
# IASI Retrieval Demo: Cloud Optical Depth



# IASI Retrieval Demo: Cloud Particle Size

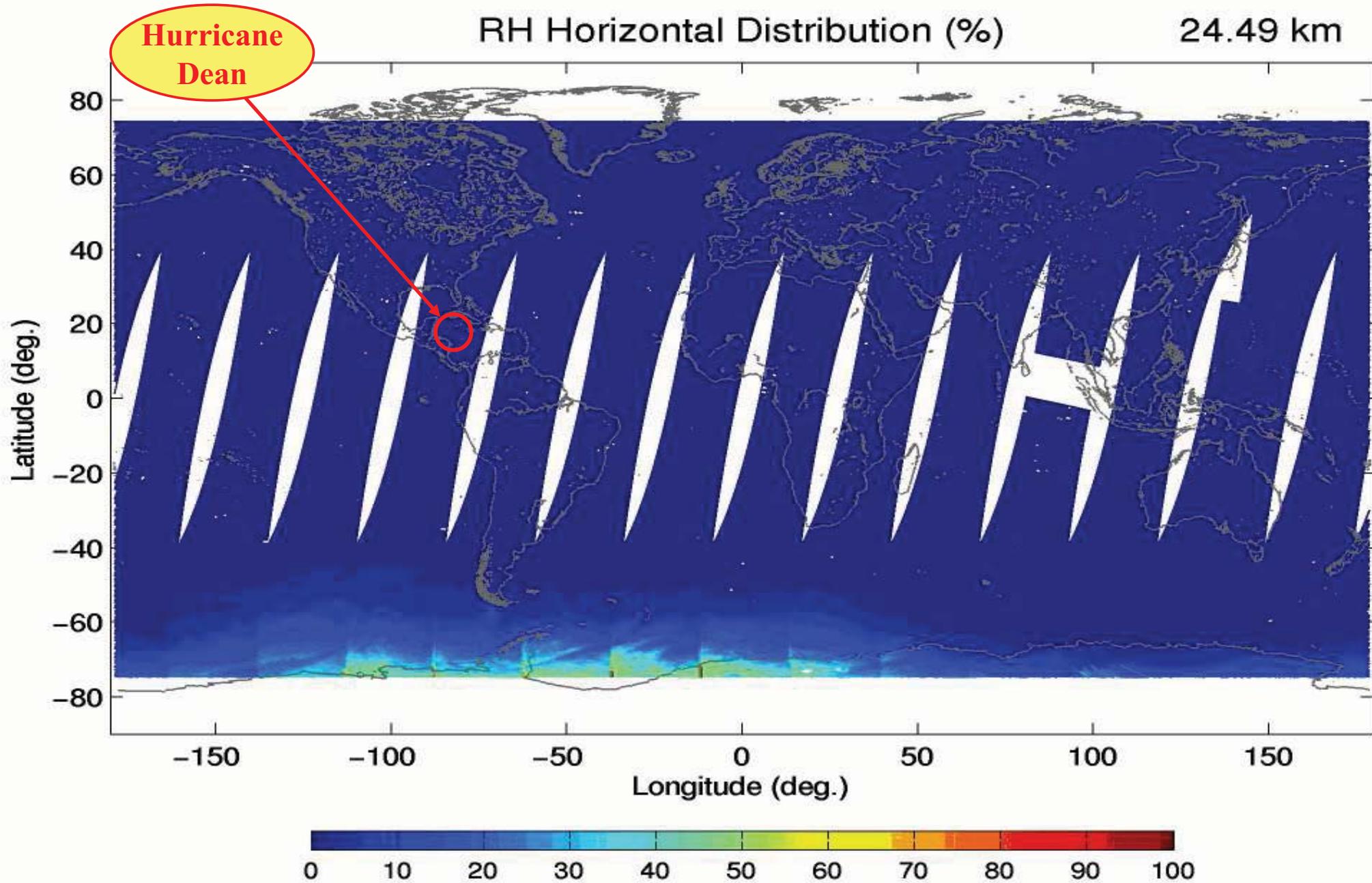


# IASI Retrieval Demo: Surface Skin Temp



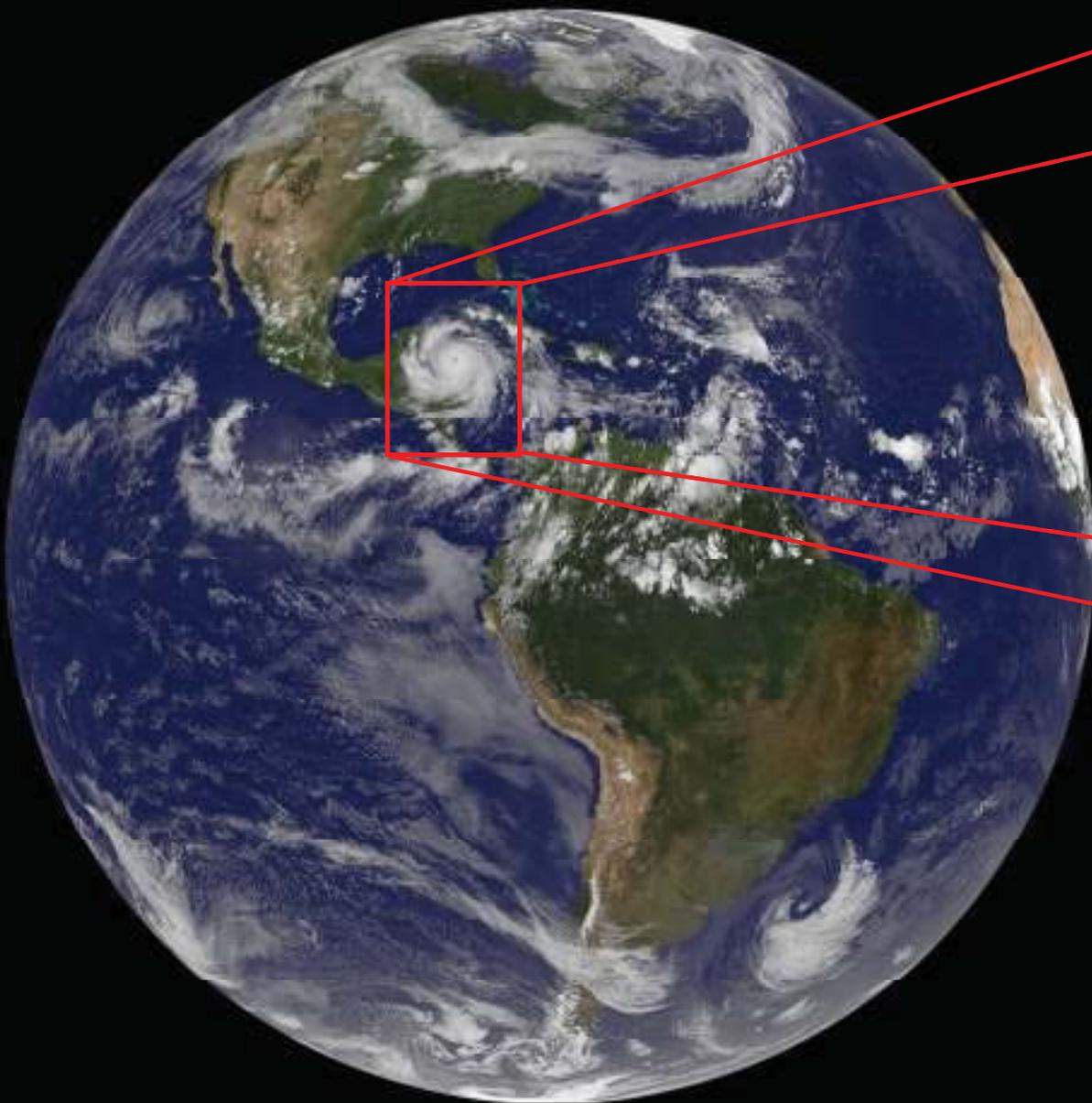


# IASI Retrieval Demo: Moisture Distribution





# Hurricane Dean (2007.8.20)



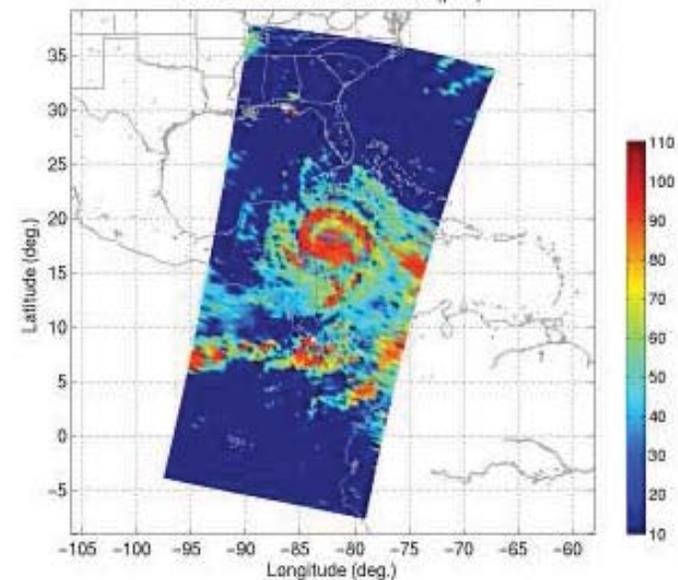
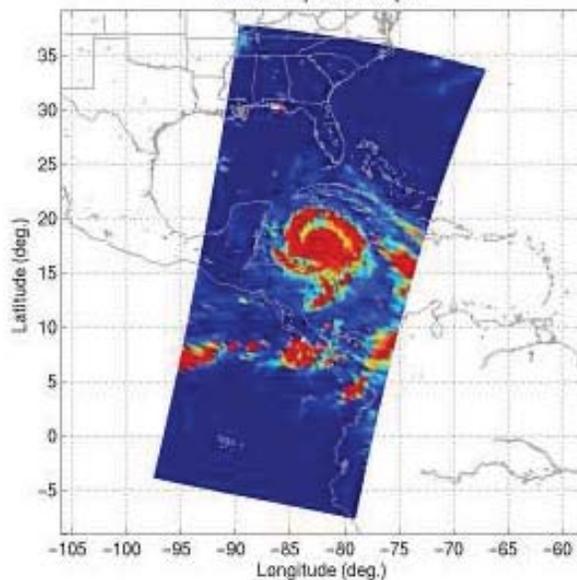
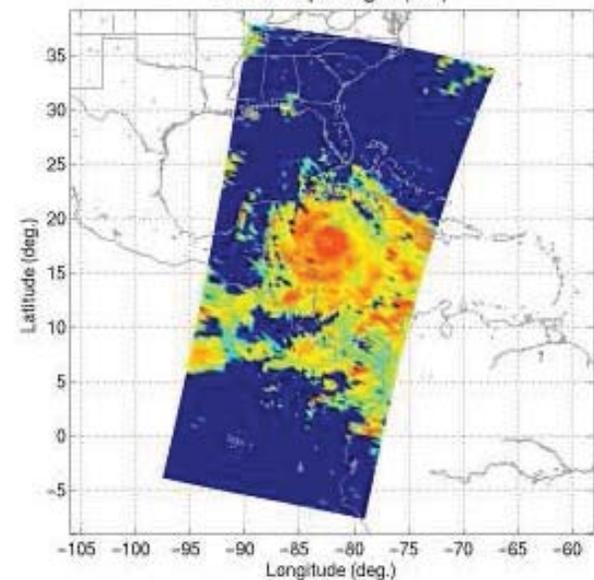
**This image of Hurricane Dean is a combination of observations from NASA and NOAA satellites. The clouds were observed by a NOAA GOES-12 at 20:45 UTC on 20<sup>th</sup> August 2007. The land surface is a summertime image from the NASA Blue Marble image collection.**

# Hurricane Dean Observed with IASI

Cloud Top Height (km)

Cloud Optical Depth

Cloud Particle Diameter ( $\mu\text{m}$ )

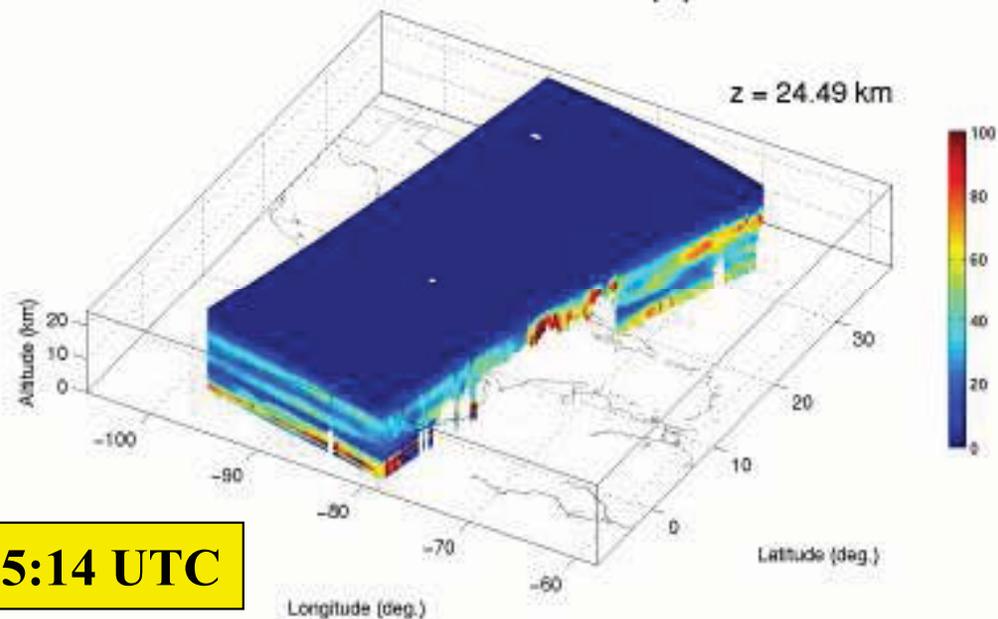
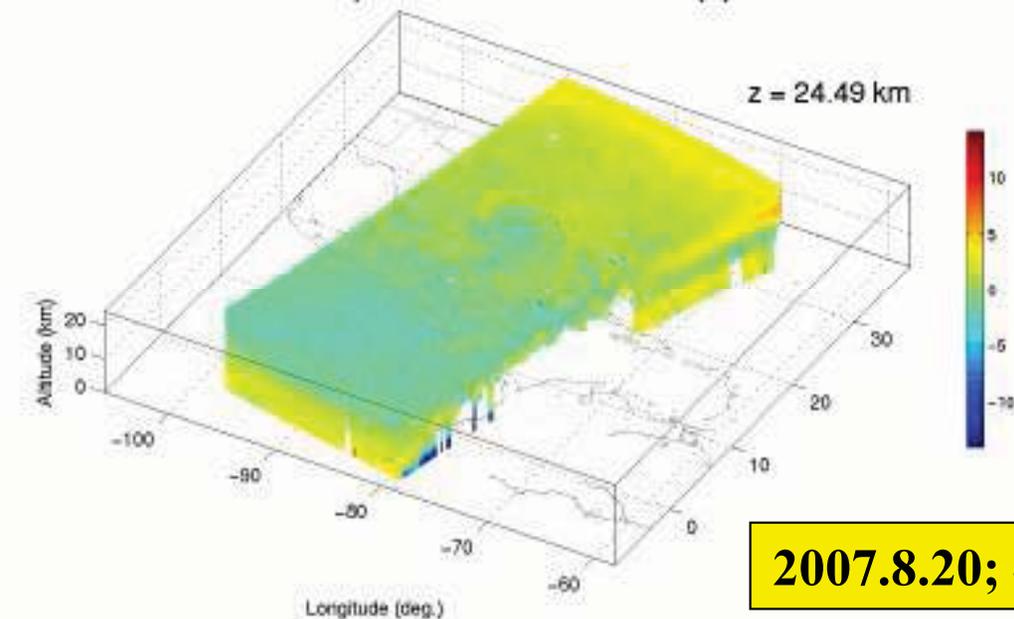


$\Delta\text{Temp}$  Horizontal Cross Section (K)

RH Horizontal Cross Section (%)

$z = 24.49$  km

$z = 24.49$  km



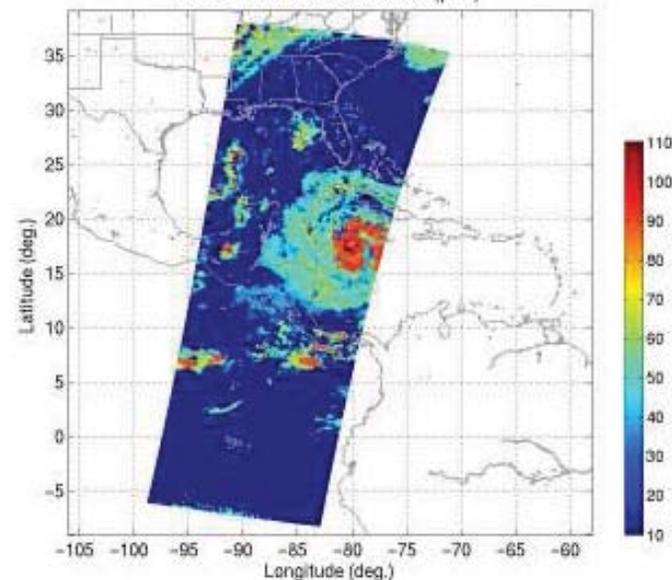
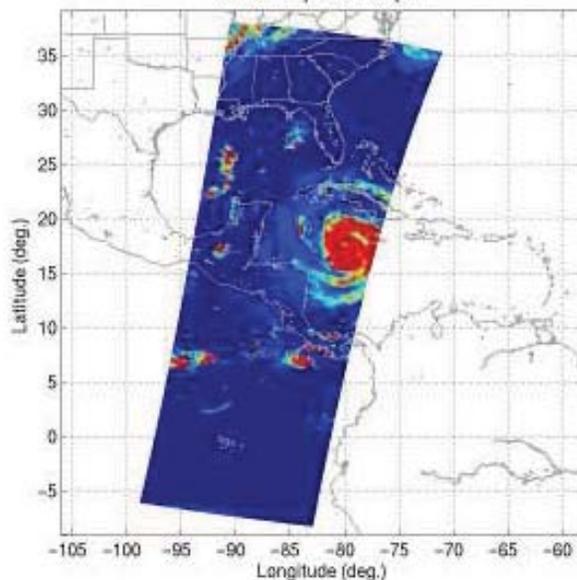
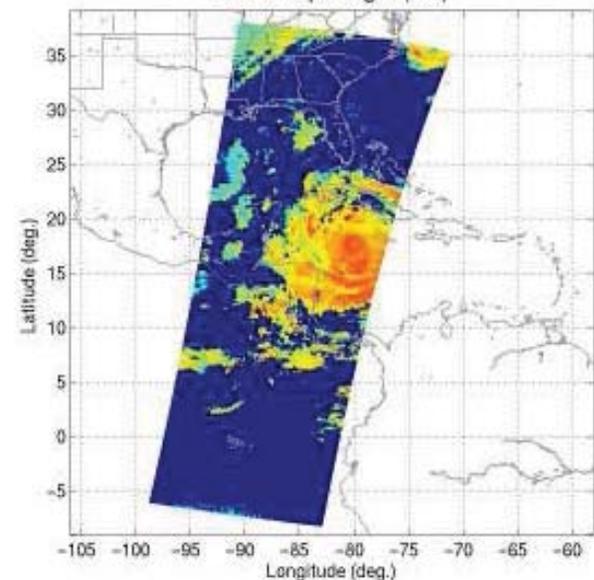
**2007.8.20; ~15:14 UTC**

# Hurricane Dean Observed with AIRS

Cloud Top Height (km)

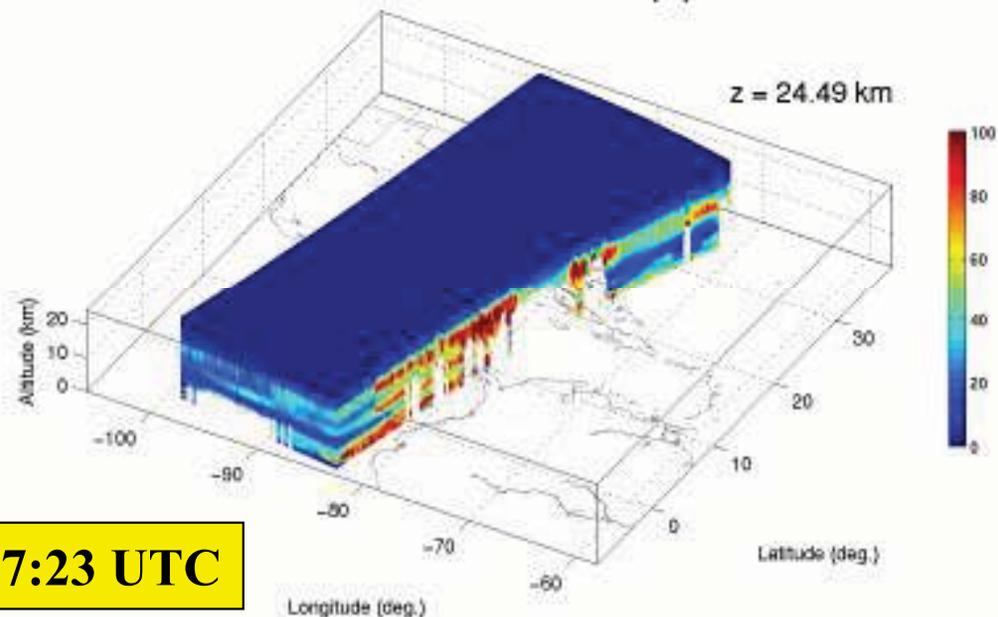
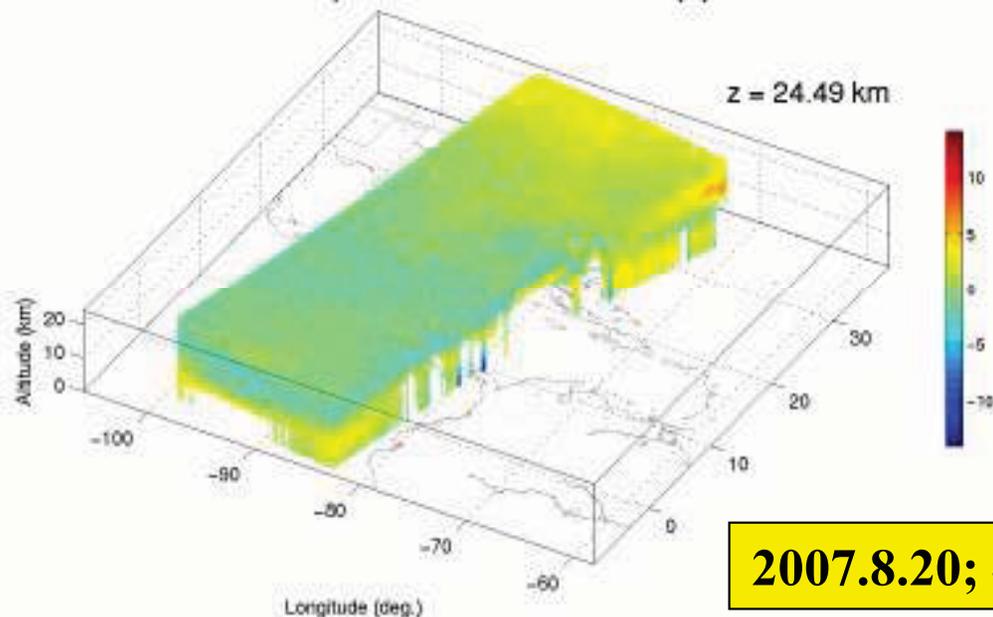
Cloud Optical Depth

Cloud Particle Diameter ( $\mu\text{m}$ )



$\Delta\text{Temp}$  Horizontal Cross Section (K)

RH Horizontal Cross Section (%)

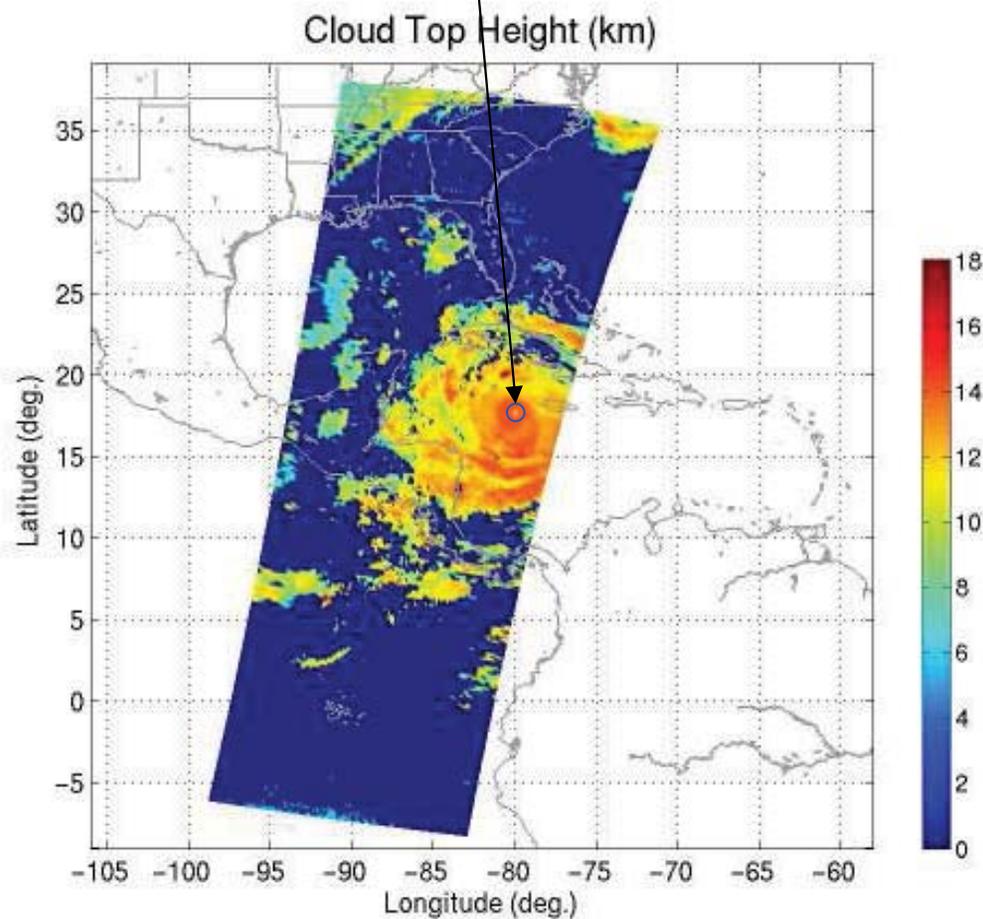
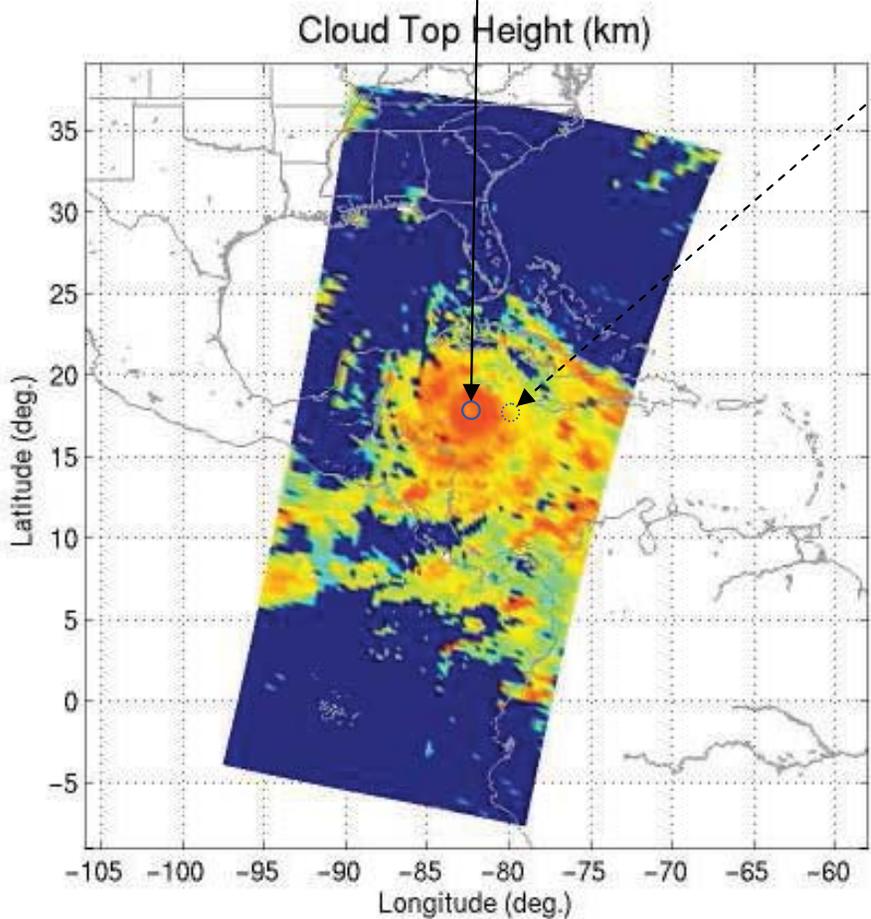


**2007.8.20; ~07:23 UTC**

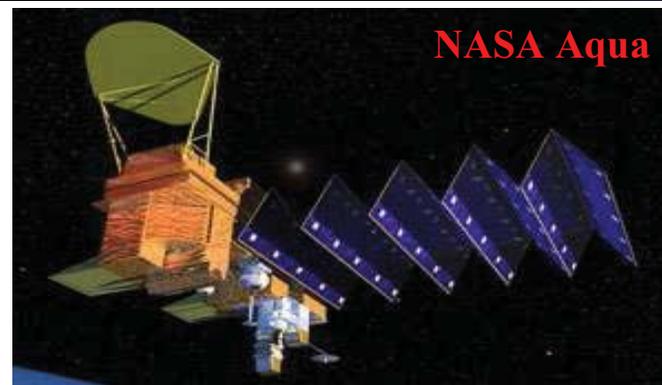
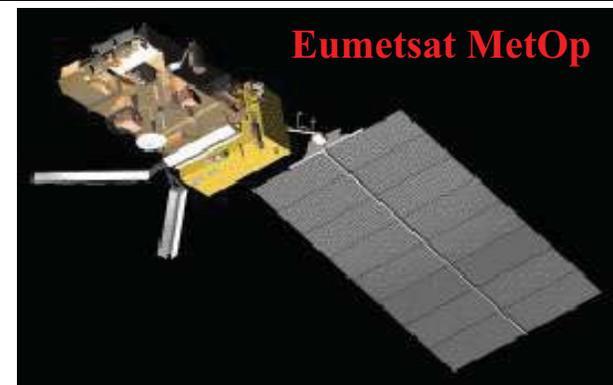
# IASI vs. AIRS: Cloud Top Height

**Metop Satellite / IASI**  
Time: ~15:14 UTC  
Eye Location: 17.8 N, 82.5 W

**Aqua Satellite / AIRS**  
Time: ~07:23 UTC  
Eye Location: 17.7 N, 80.0 W



# Joint Airborne IASI Validation Exp.



## Location/dates:

Ellington Field (EFD), Houston, TX, 14 Apr – 4 May, 2007.

## Aircraft:

NASA WB-57 (NASt-I, NASt-M, S-HIS);

UK FAAM BAe146-301 (ARIES, MARSS, SWS; dropsondes; in-situ cloud phys. & trace species; etc.).

## Satellites:

Metop (IASI, AMSU, MHS, AVHRR, HIRS).

A-train (Aqua AIRS, AMSU, HSB, MODIS; Aura TES; CloudSat; and Calipso).

## Ground-sites:

DOE ARM CART ground site (radiosondes, lidar, etc.)

## Participants:

include NASA, UW, MIT, IPO, NOAA, UKMO, EUMETSAT, ECMWF, ...

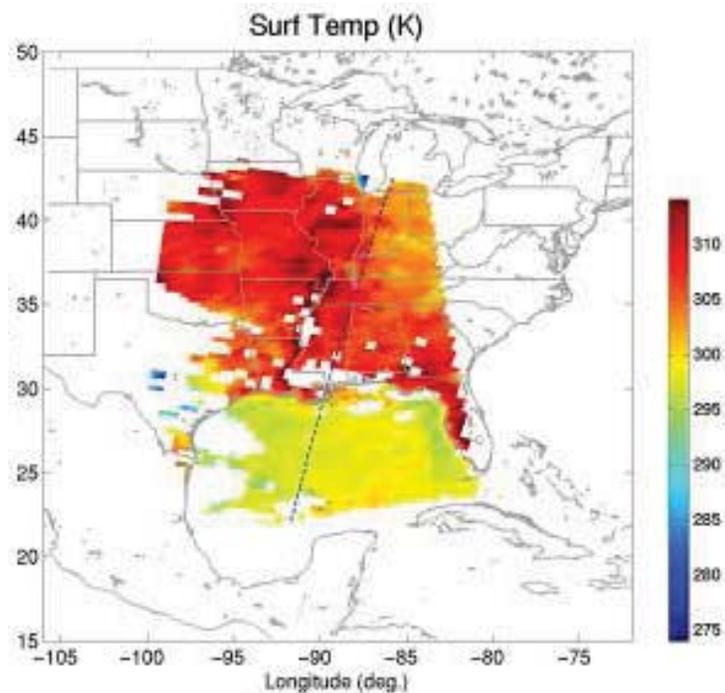
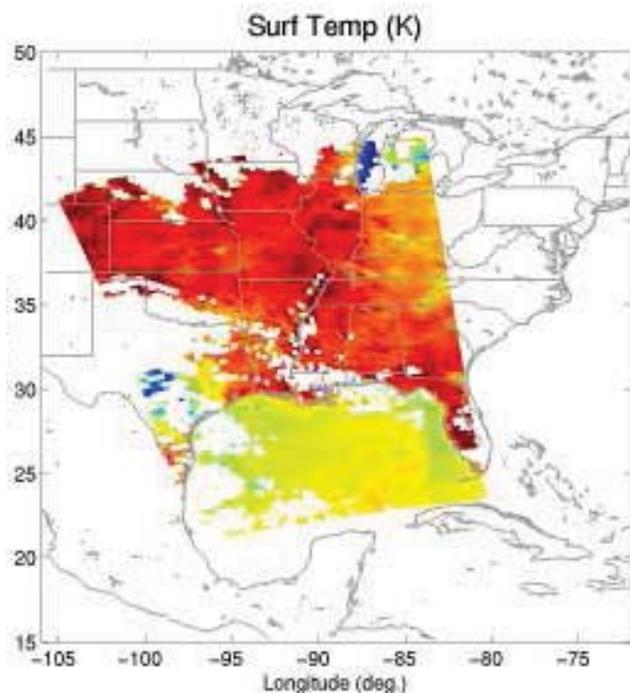
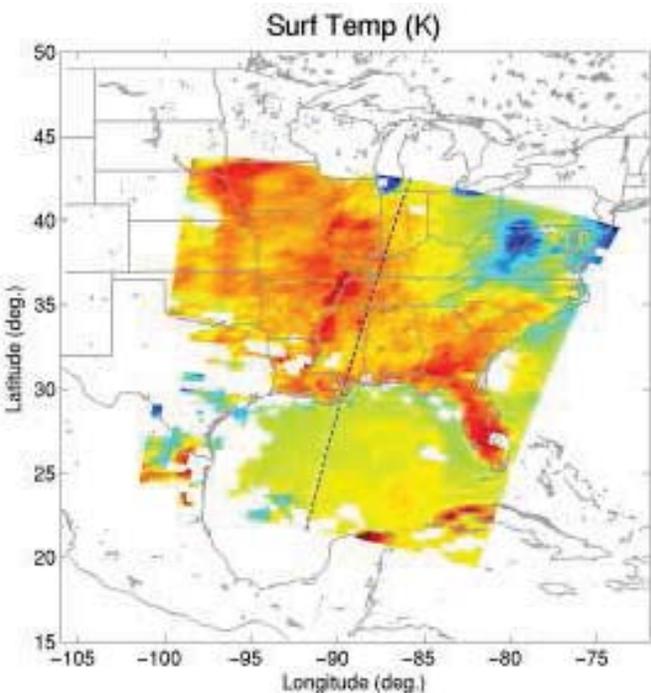


# Case Study and Validation (2007.04.29)

IASI @ ~15:48 UTC

AIRS @ ~19:30 UTC

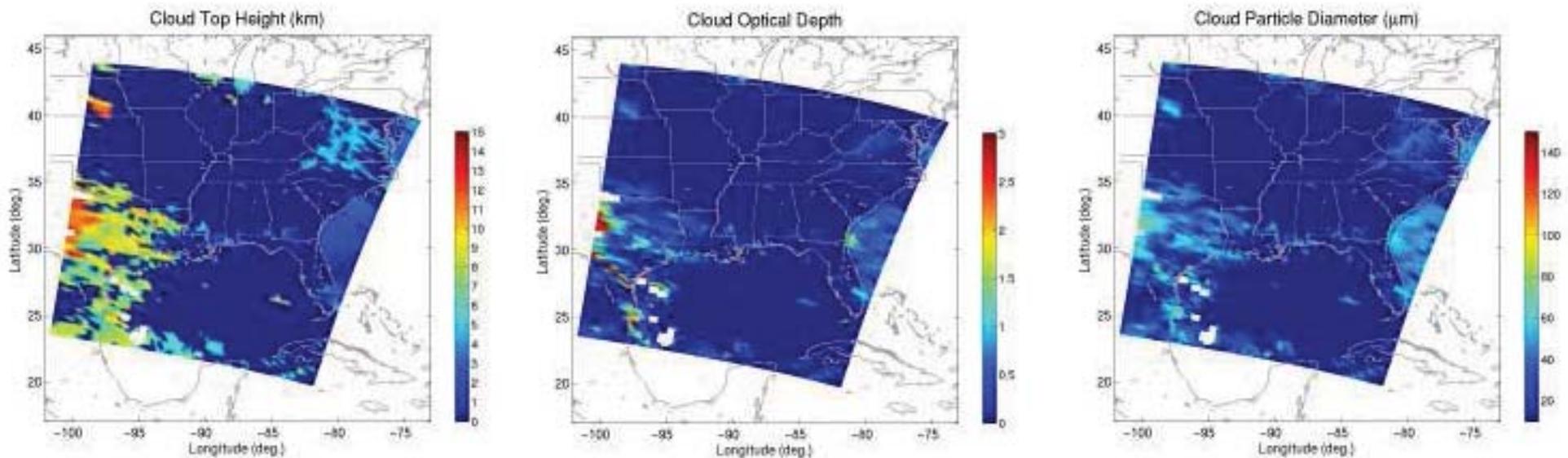
→ AIRS Interoperated to IASI FOV



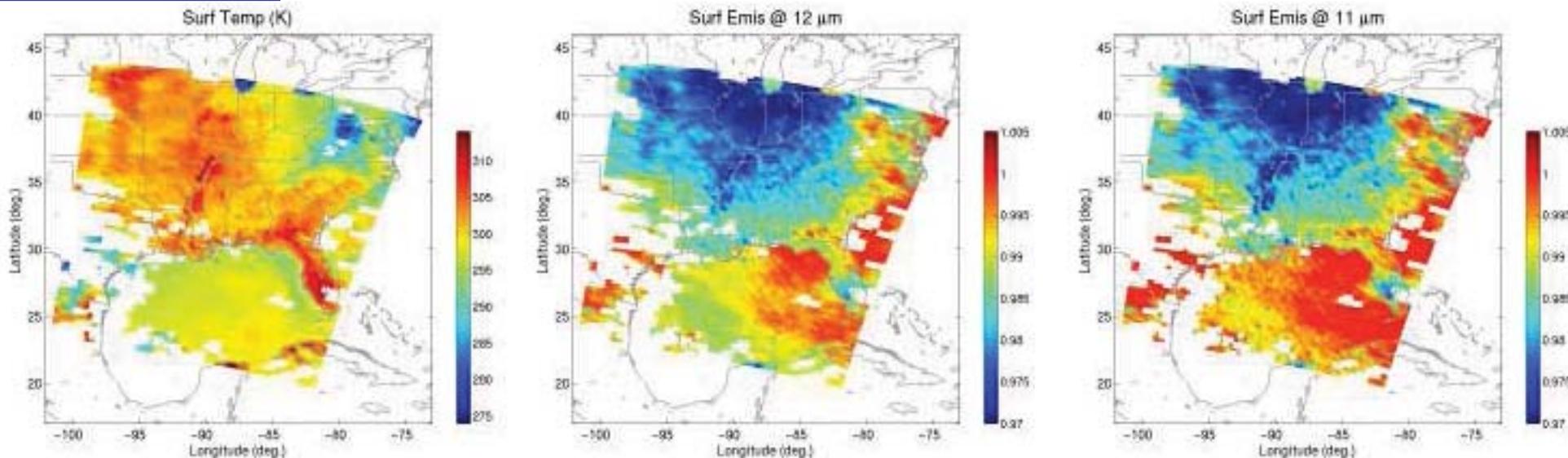
IASI and AIRS inter-comparison at the same geophysical location and same horizontal resolution

# IASI Retrieval: Cloud & Surface

## Cloud Parameters:

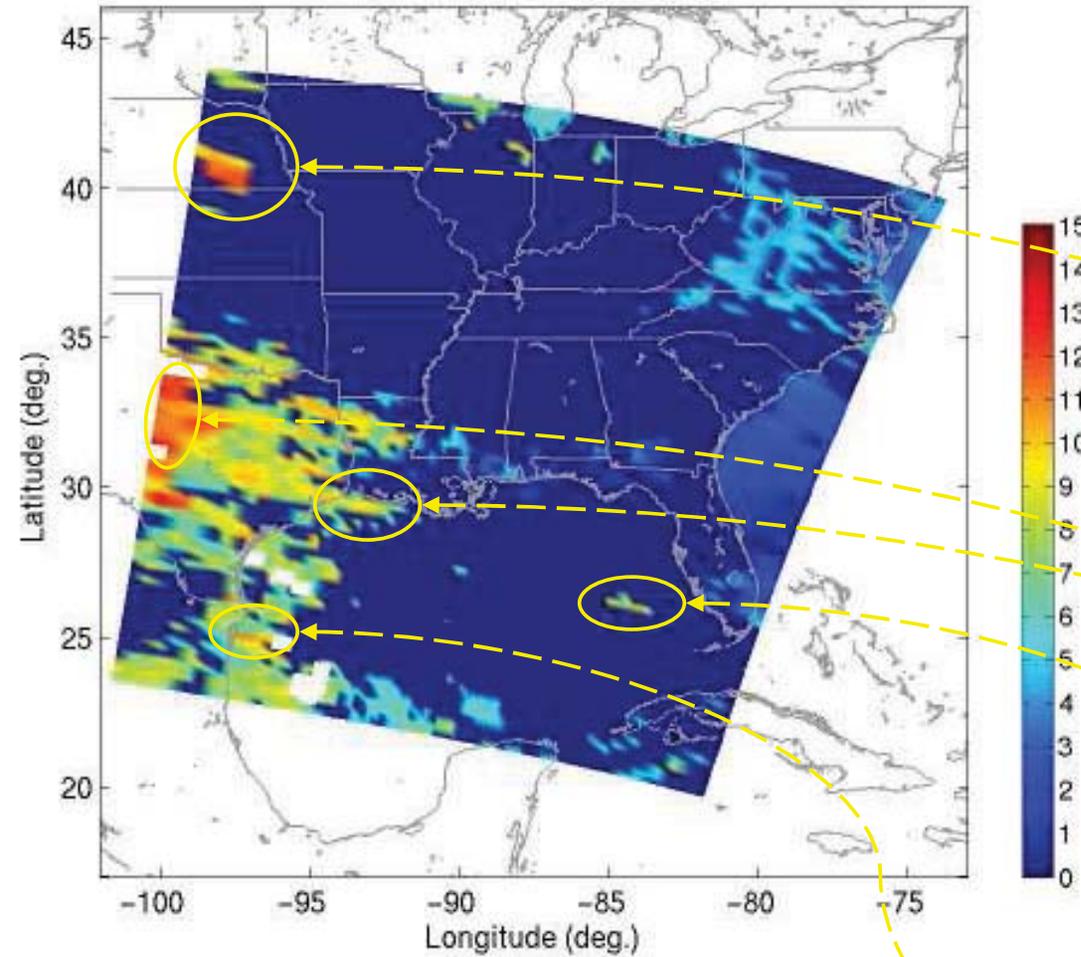


## Surface Properties:

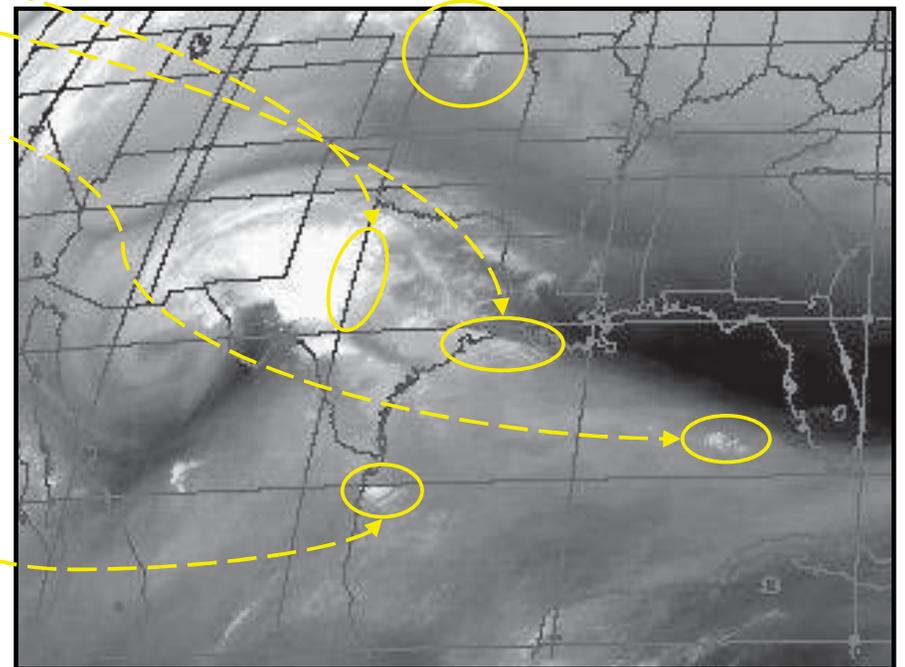


# IASI Cloud vs. GOES Image (4.29.2007)

## IASI Cloud Top Height (km)

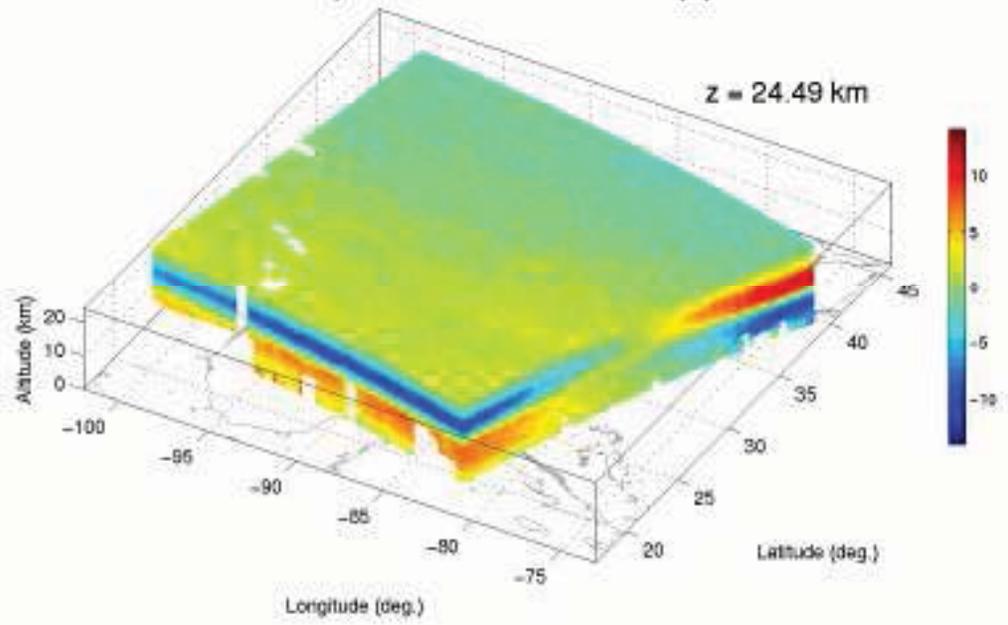


**15:32 UTC GOES IR**

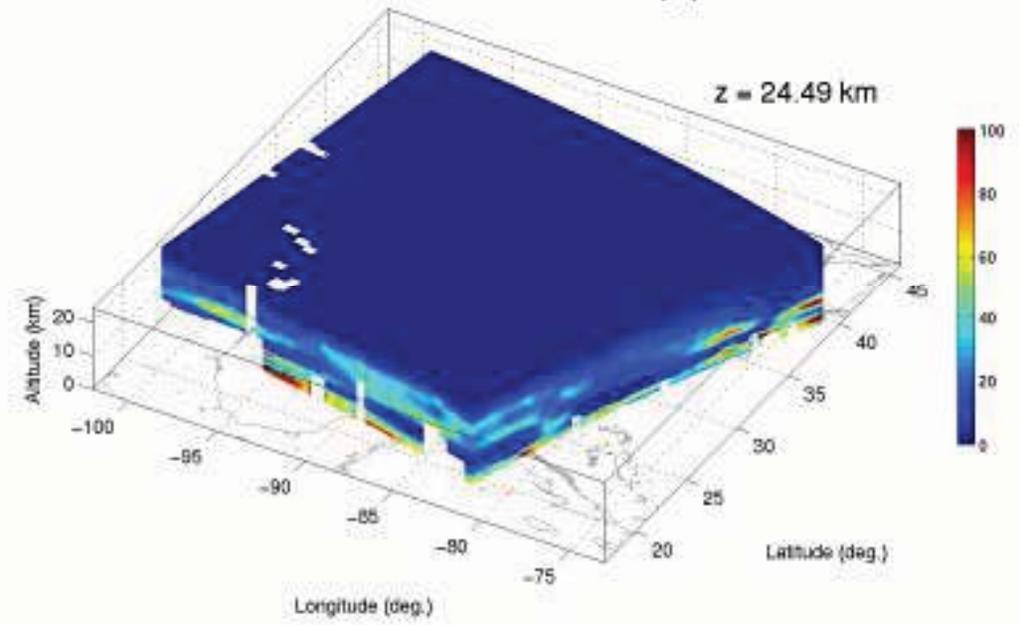


# IASI Retrieval: $\Delta$ Temp and RH Fields

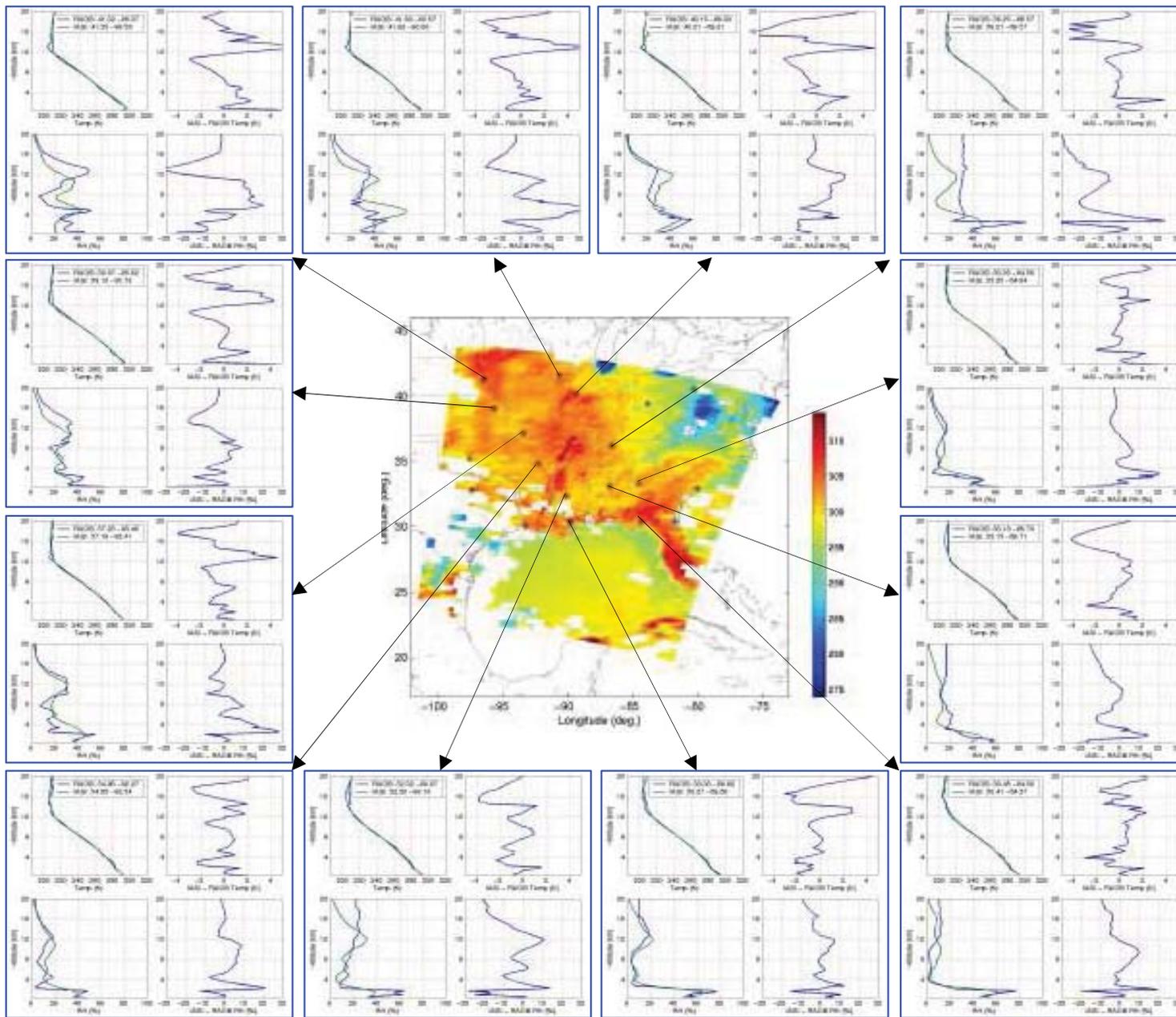
$\Delta$ Temp Horizontal Cross Section (K)



RH Horizontal Cross Section (%)

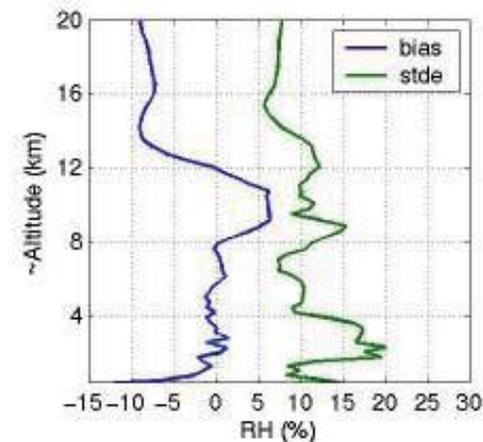
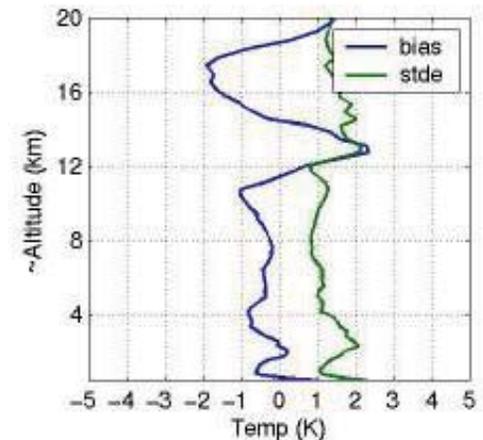


# IASI Retrievals vs. Radiosondes



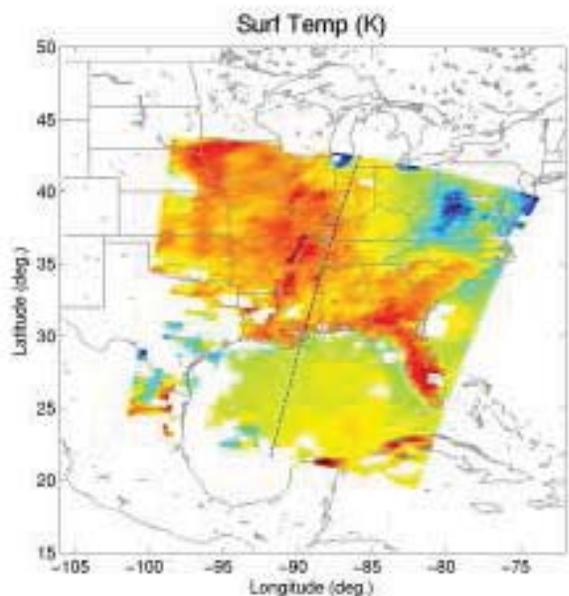
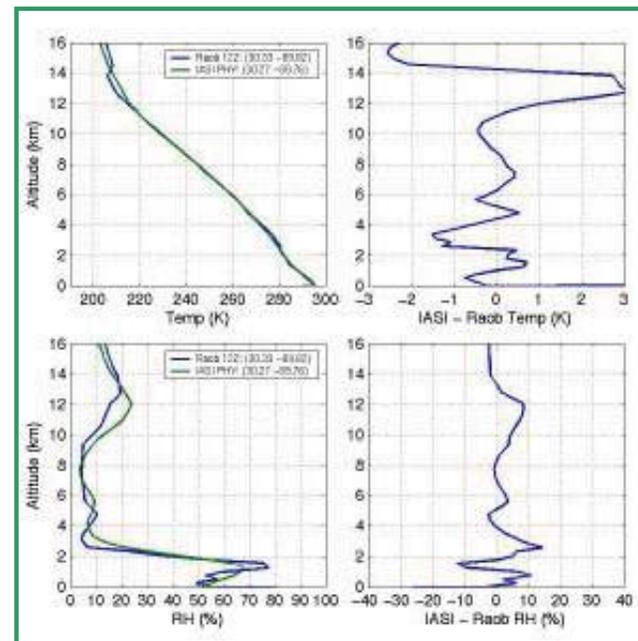
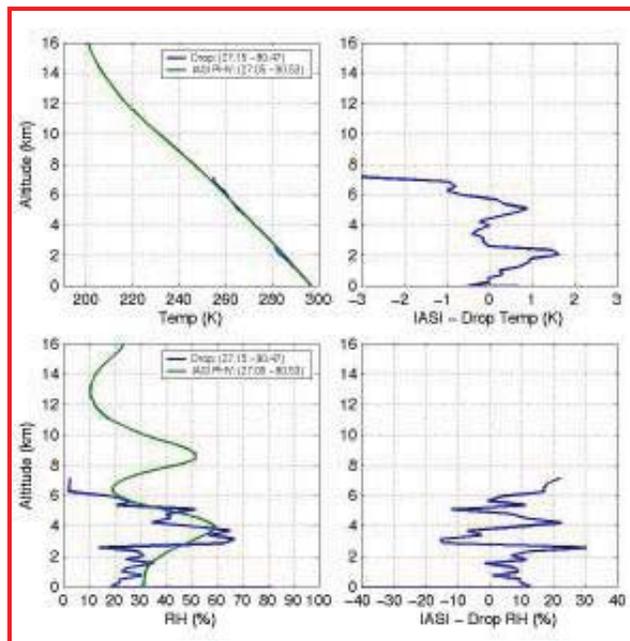
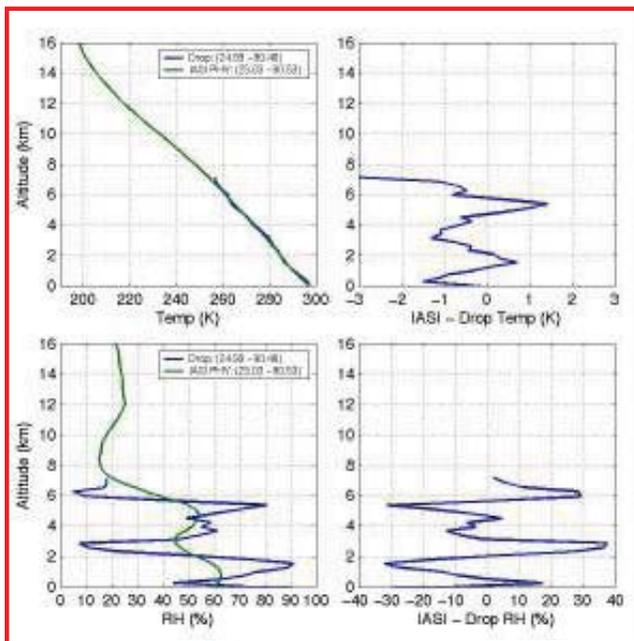
**Note:**  
 12:00 UTC = 07:00 Local  
 15:48 UTC = 10:48 Local

**Radiosonde and IASI retrieval comparison and statistical profiles over 20 radiosondes**





# High-Vertically-Resolved Retrievals



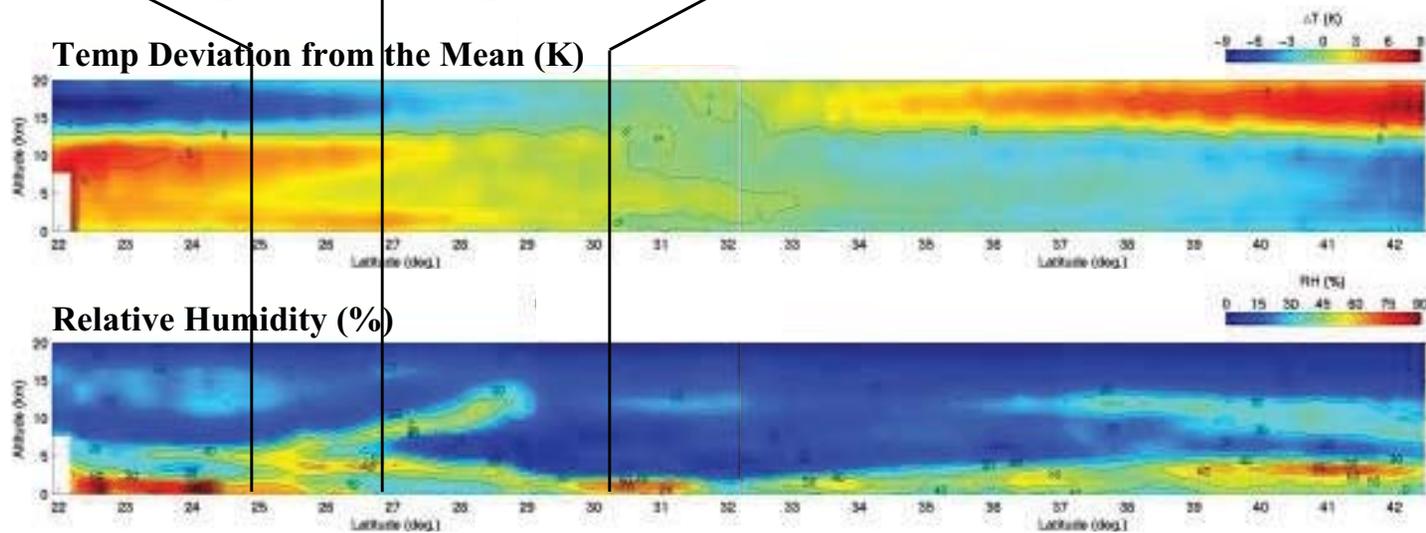
Drop

Drop

Raob

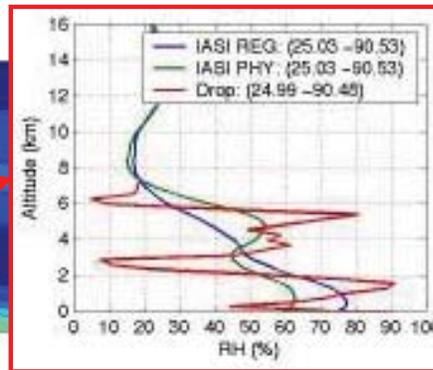
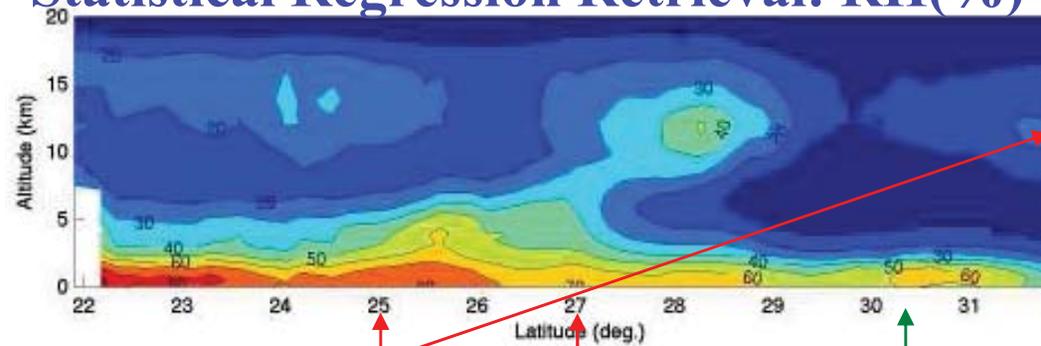
Temp Deviation from the Mean (K)

Relative Humidity (%)

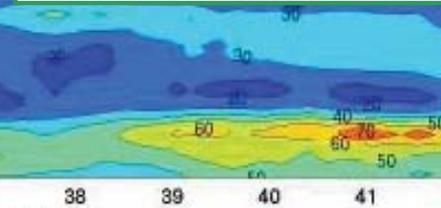
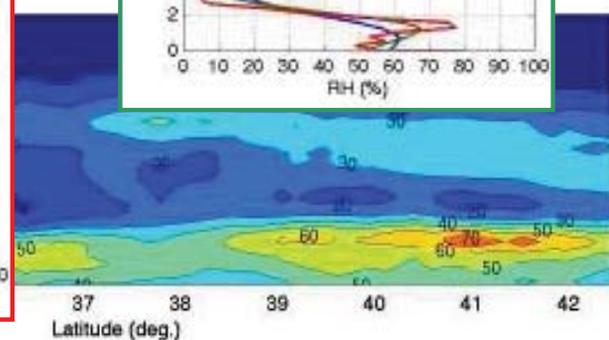
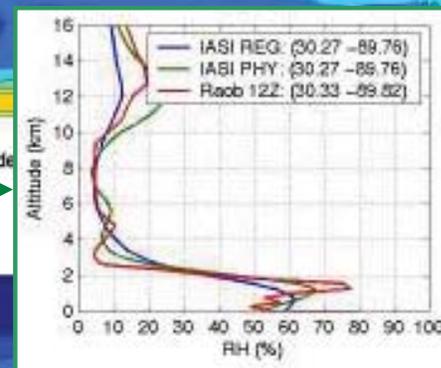
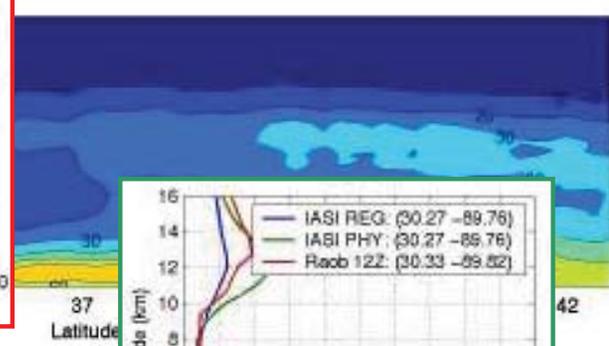
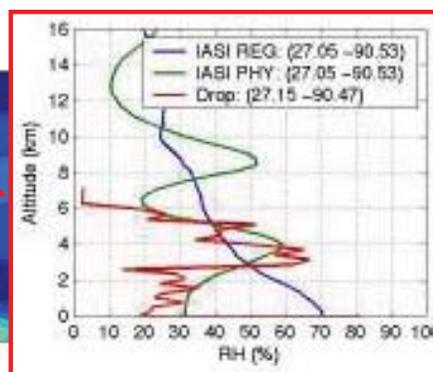
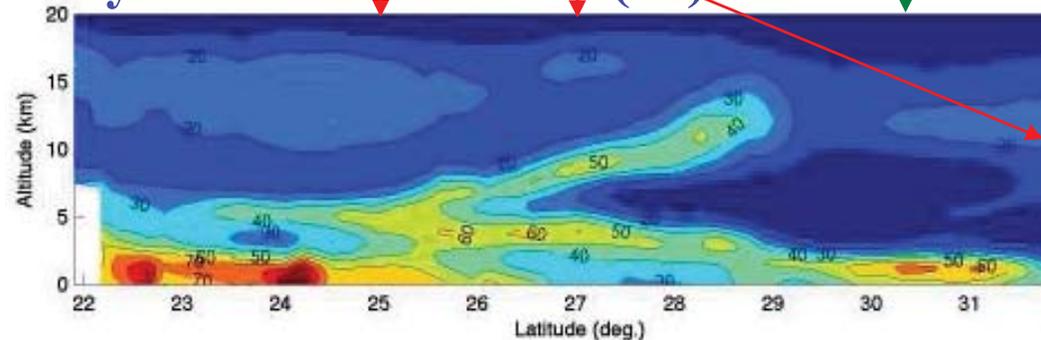


# IASI Regression vs. Physical Retrieval

## Statistical Regression Retrieval: RH(%)



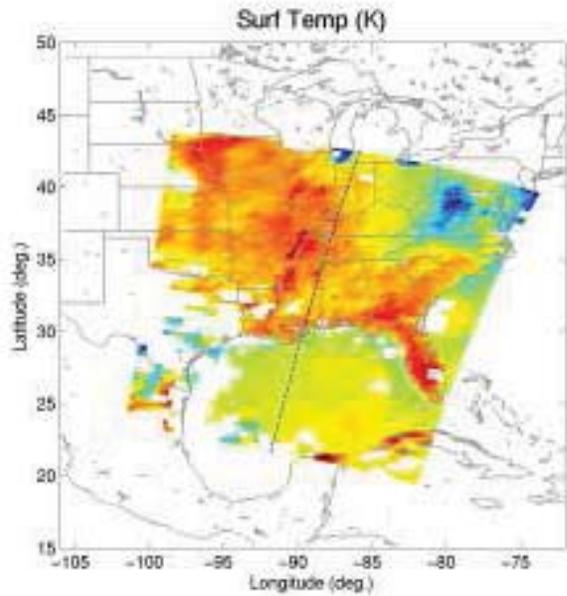
## Physical Retrieval: RH(%)



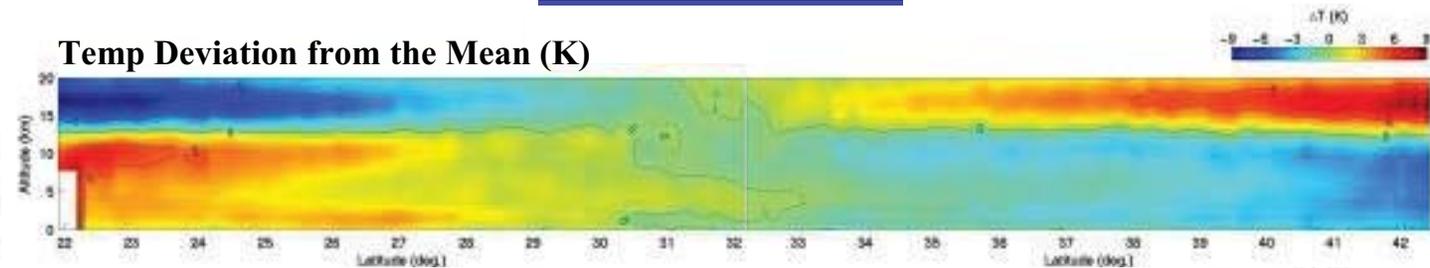
1. The retrieval improvement based on the EOF statistical regression through physical iterative retrieval is only contributed by IASI measurements as the minimum information methodology used.
2. A high-vertically-resolved atmospheric structure is captured very well by IASI measurements and/or retrievals; not only in the troposphere, but also in the boundary layer.

# IASI (15:48 UTC) vs. AIRS (19:30 UTC)

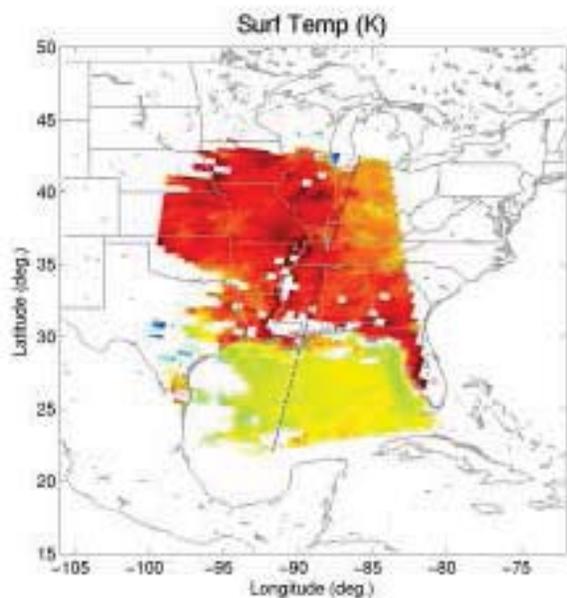
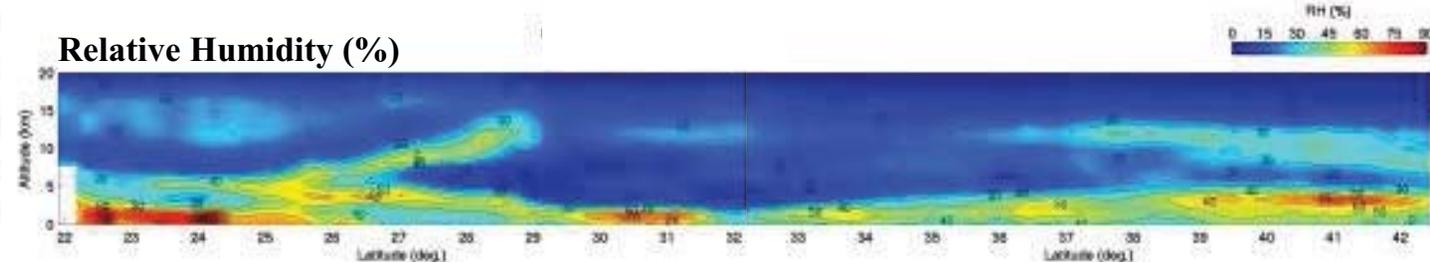
## IASI Retrieval



Temp Deviation from the Mean (K)

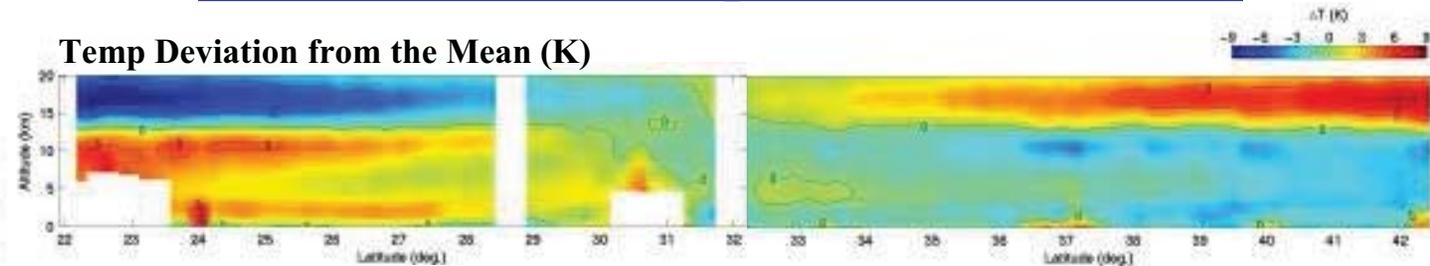


Relative Humidity (%)

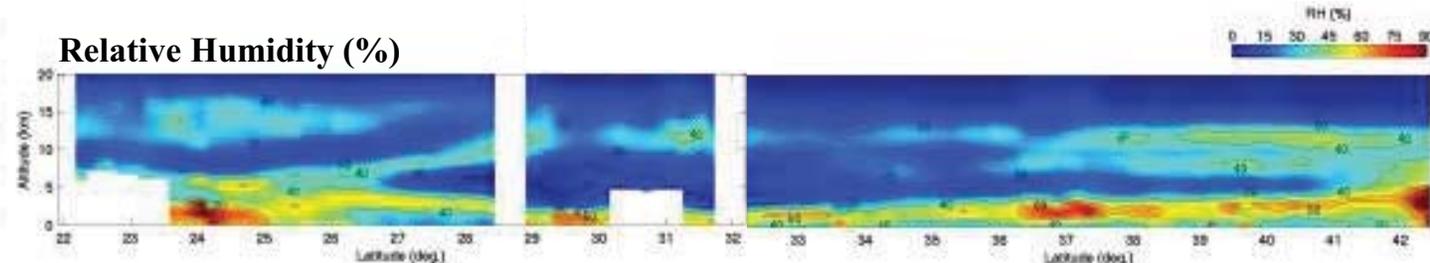


## AIRS Retrieval Interpolated to IASI FOV

Temp Deviation from the Mean (K)

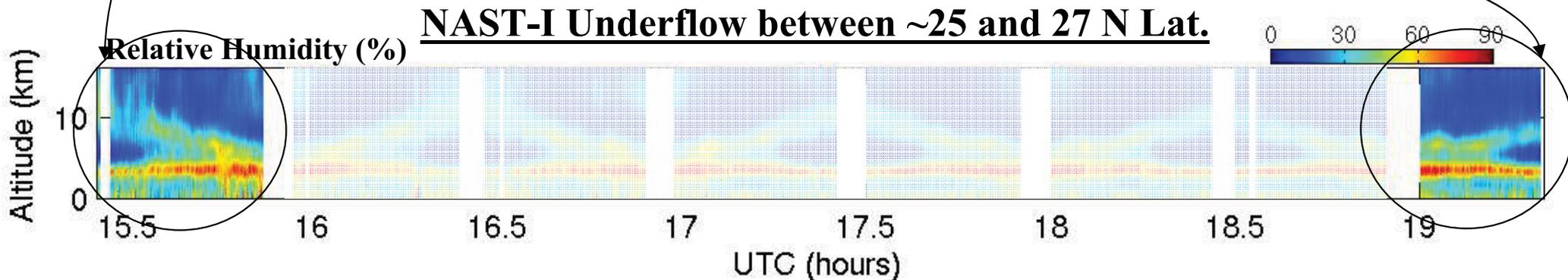
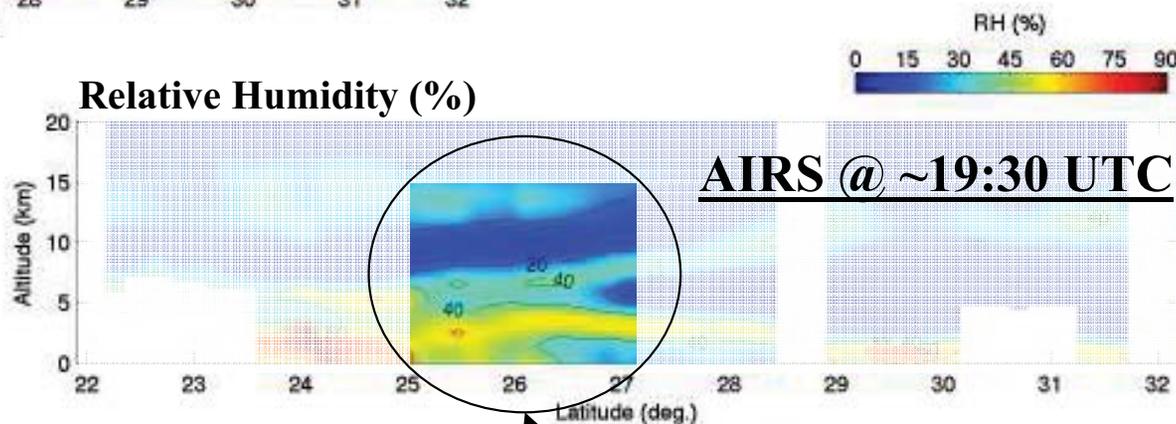
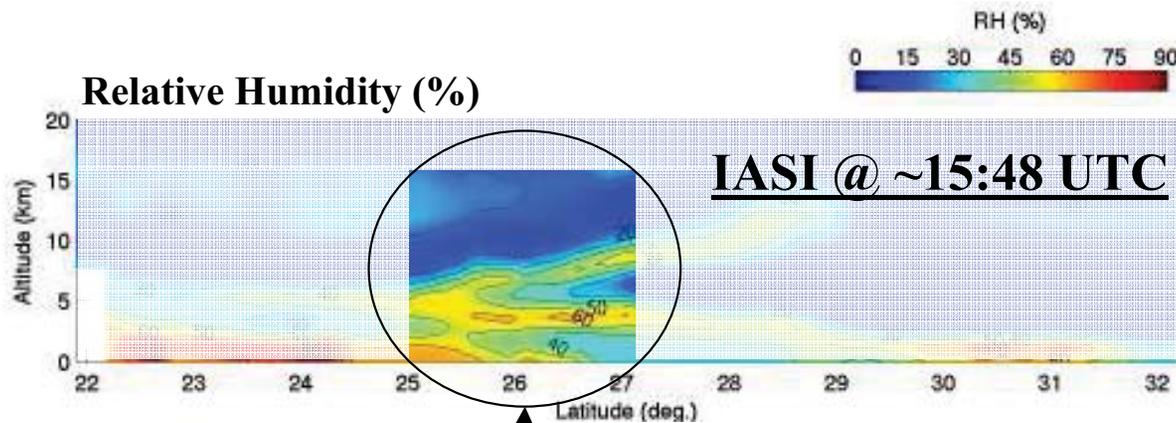


Relative Humidity (%)





# NAST-I: Connection between IASI and AIRS



# Summary and Future Work

- 1. A state-of-the-art IR-only retrieval algorithm has been developed with an all-seasonal-global EOF Physical Regression and followed by 1-D Var. Physical Iterative Retrieval for IASI, AIRS, and NAST-I.**
- 2. The benefits of this retrieval are to produce atmospheric structure with a single FOV horizontal resolution (~15 km for IASI and AIRS), accurate profiles above the cloud (at least) or down to the surface, surface parameters, and/or cloud microphysical parameters.**
- 3. Initial case study and validation indicates that surface, cloud, and atmospheric structure (include TBL) are well captured by IASI and AIRS measurements. Coincident dropsondes during the IASI and AIRS overpasses are used to validate atmospheric conditions, and accurate retrievals are obtained with an expected vertical resolution.**
- 4. JAIVEx has provided the data needed to validated retrieval algorithm and its products which allows us to assess the instrument ability and/or performance.**
- 5. Retrievals with global coverage are under investigation for detailed retrieval assessment. It is greatly desired that these products be used for testing the impact on Atmospheric Data Assimilation and/or Numerical Weather Prediction.**

# IASI vs. AIRS: Skin Temp.

Metop Satellite / IASI

Time: ~15:14 UTC

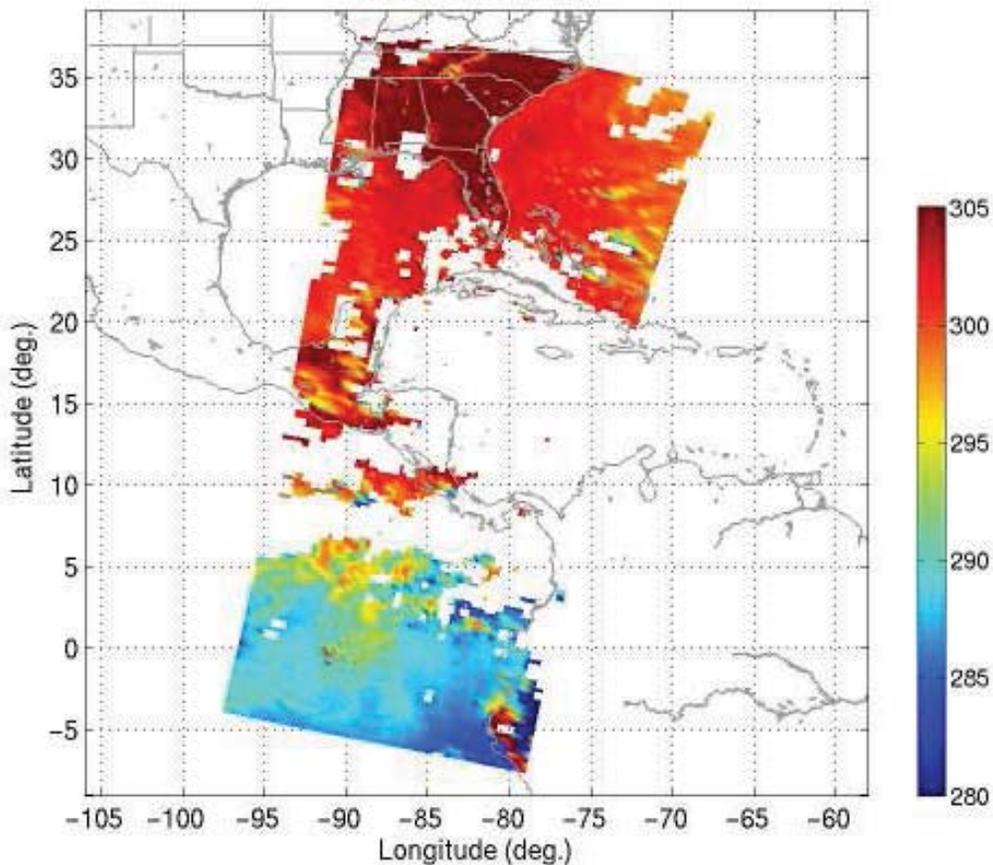
Eye Location: 17.8 N, 82.5 W

Aqua Satellite / AIRS

Time: ~07:23 UTC

Eye Location: 17.7 N, 80.0 W

Surf Temp (K)



Surf Temp (K)

